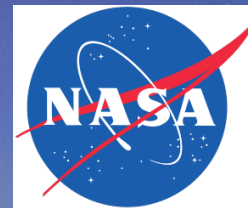


# The Arctic System Reanalysis: Motivation, Development, and Performance

David H. Bromwich

A. B. Wilson, L.-S. Bai, G. W. K. Moore, K. M. Hines, S.-H. Wang, W. Kuo, Z. Liu,  
H.-C. Lin, T.-K. Wee, M. Barlage, M. C. Serreze, J. E. Walsh, and A. Slater

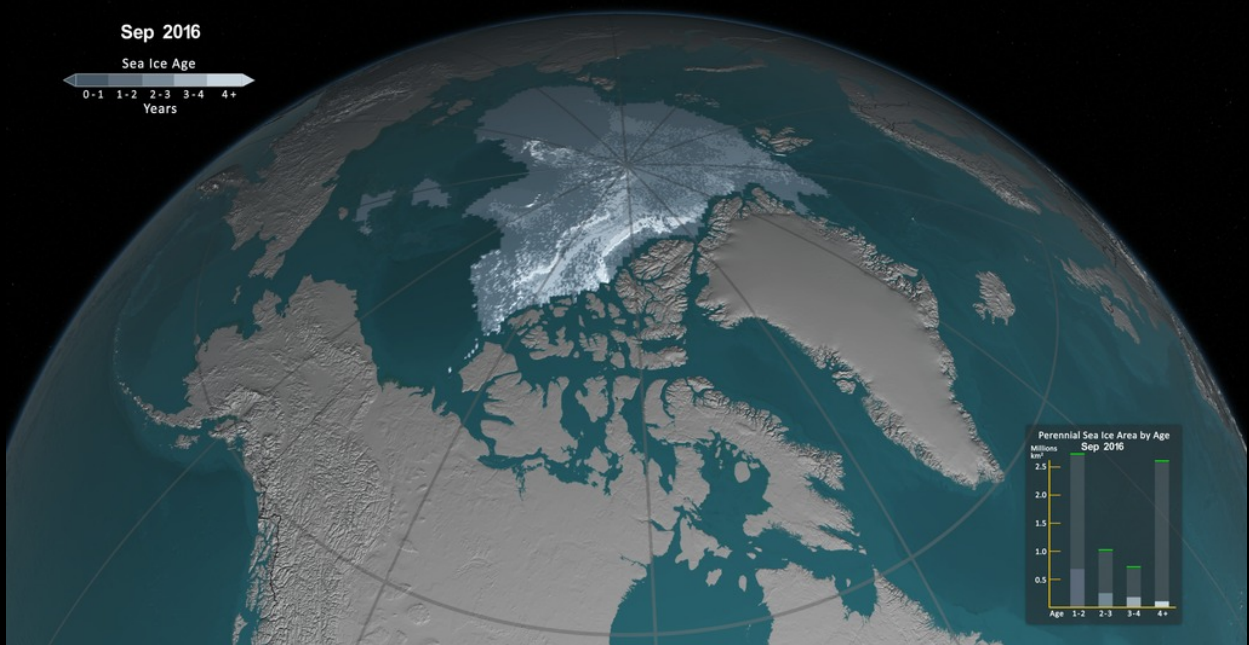
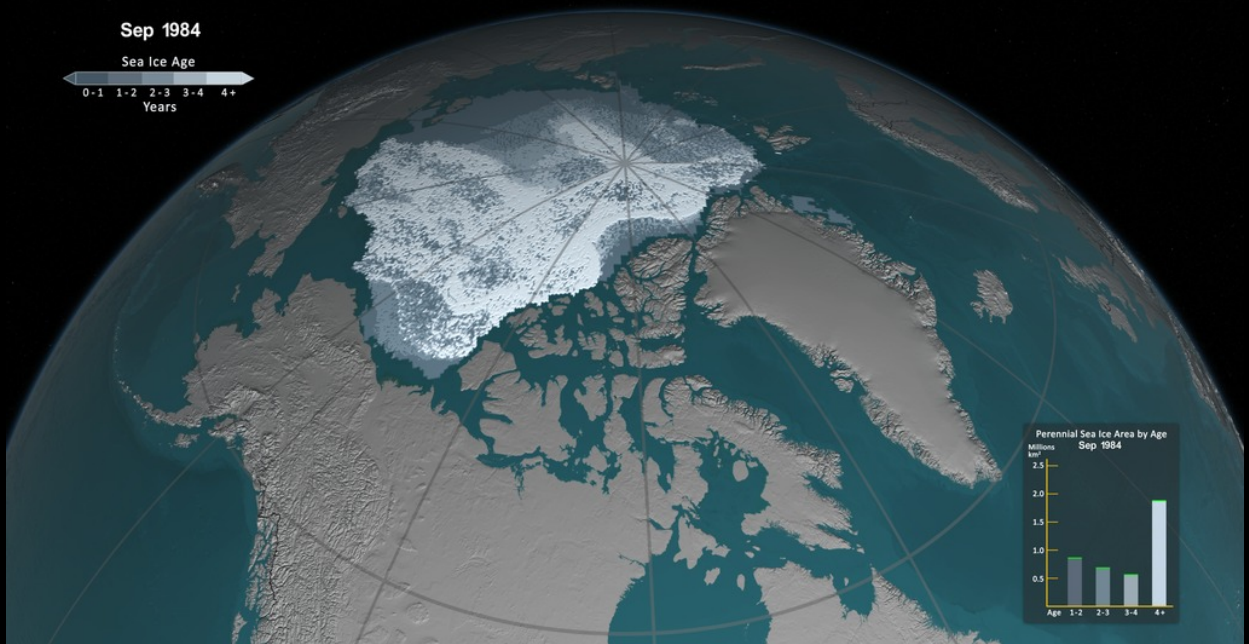


# Outline

- Arctic Climate Change
- ASR Motivation
- ASR Description
- Comparison with ERA-Interim
- Topographically Forced Winds
- Other Mesoscale Phenomena
- Next Step: ASRv3

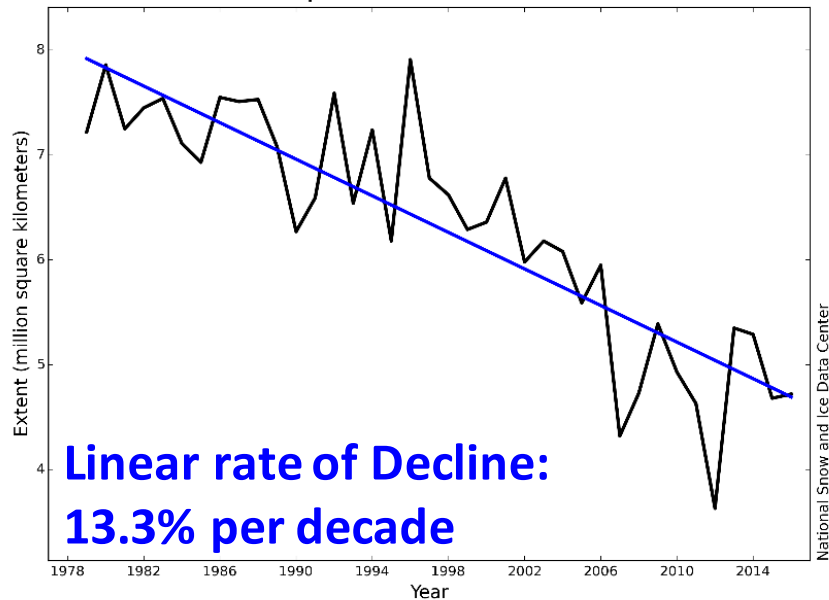


# ARCTIC SEA ICE DECLINE

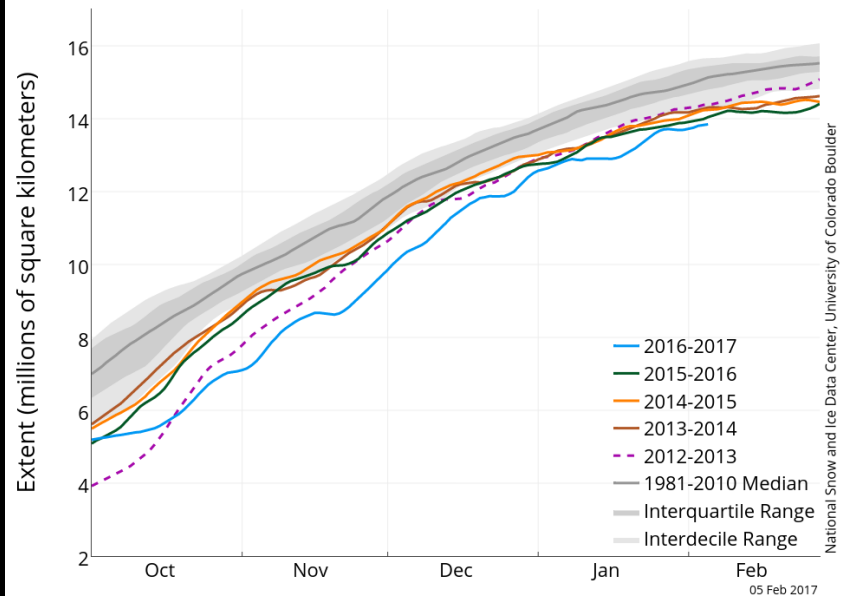


# ARCTIC SEA ICE DECLINE

Average Monthly Arctic Sea Ice Extent  
September 1979 - 2016

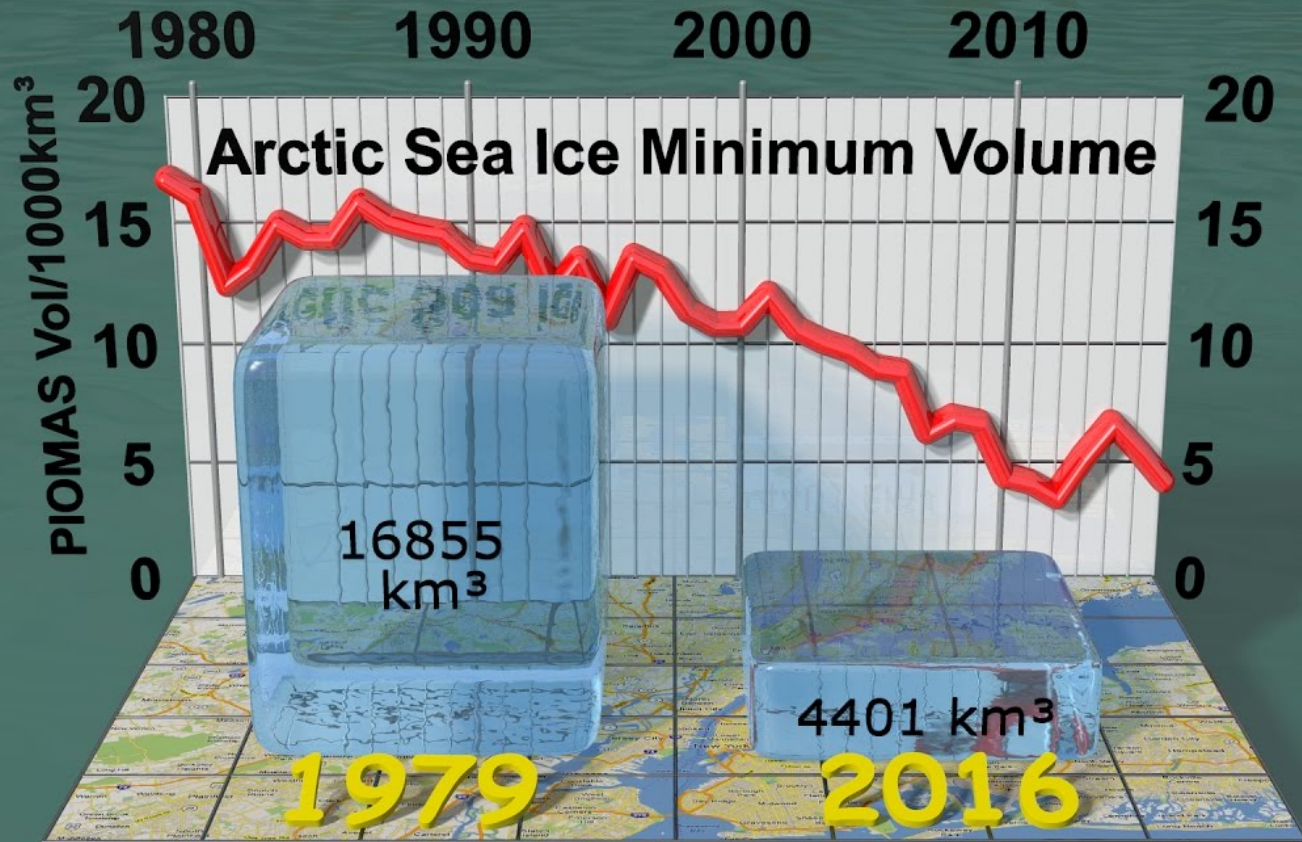


Arctic Sea Ice Extent  
(Area of ocean with at least 15% sea ice)



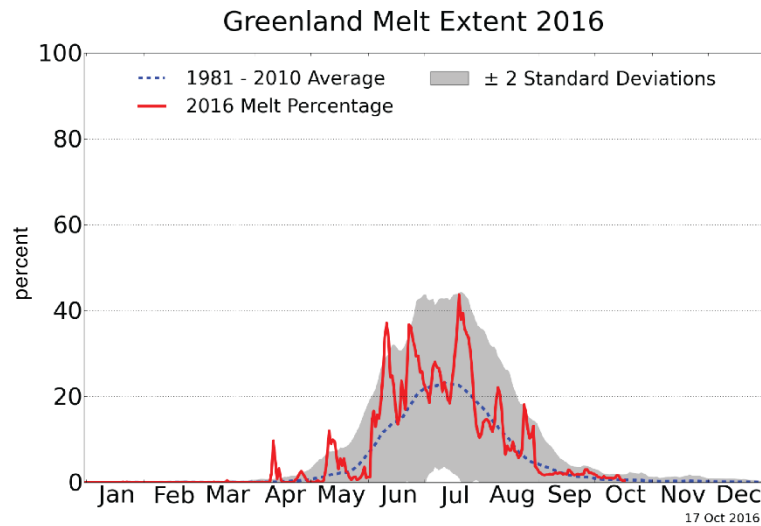
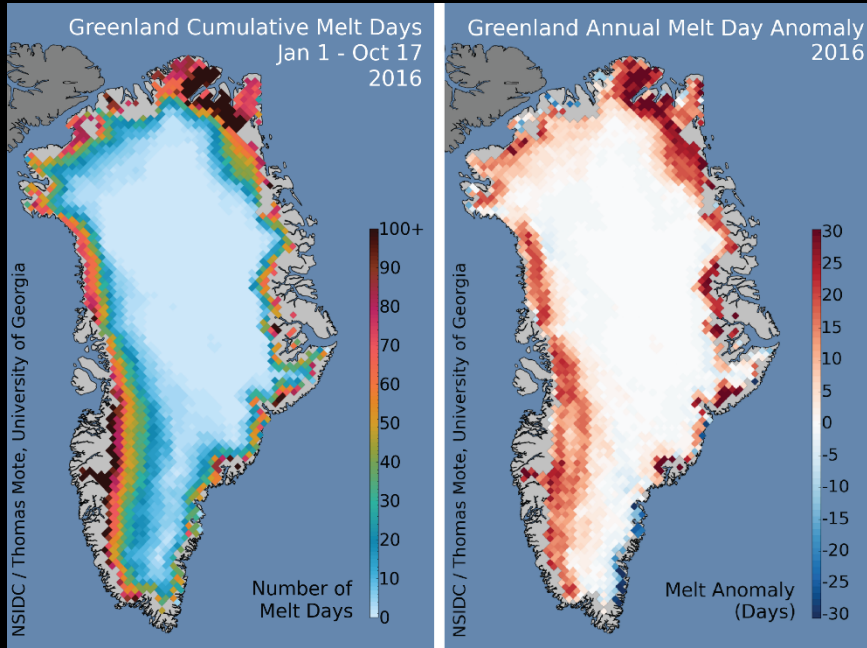


# ARCTIC SEA ICE DECLINE



Source: <http://psc.apl.washington.edu/wordpress/research/projects/arctic-sea-ice-volume-anomaly/>  
Created by: Andy Lee Robinson <http://youtube.com/ahaveland> Oct 2016

# GREENLAND MELT



NSIDC / Thomas Mote, University of Georgia

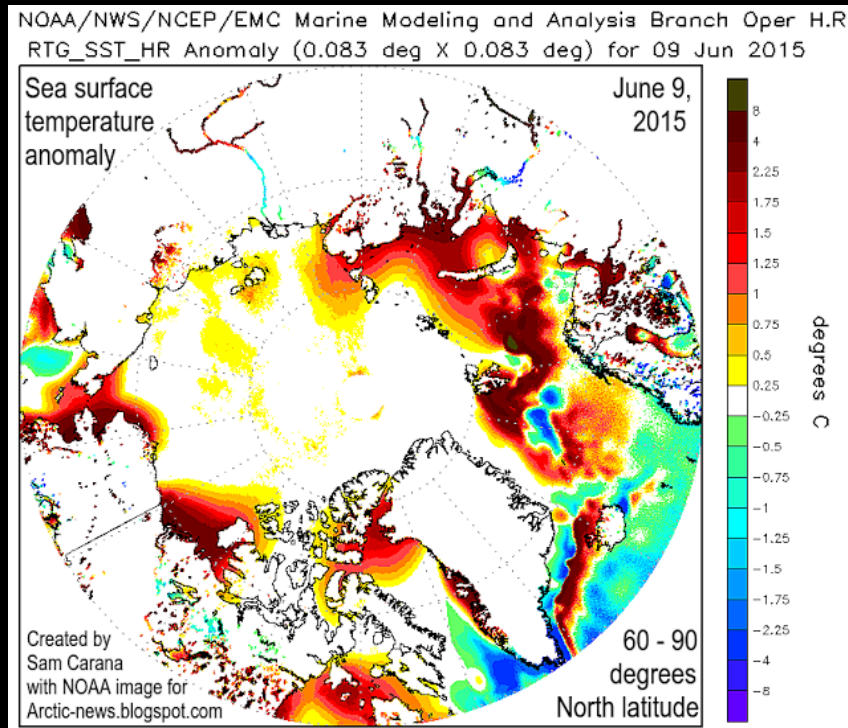




# OTHER ARCTIC CHANGES

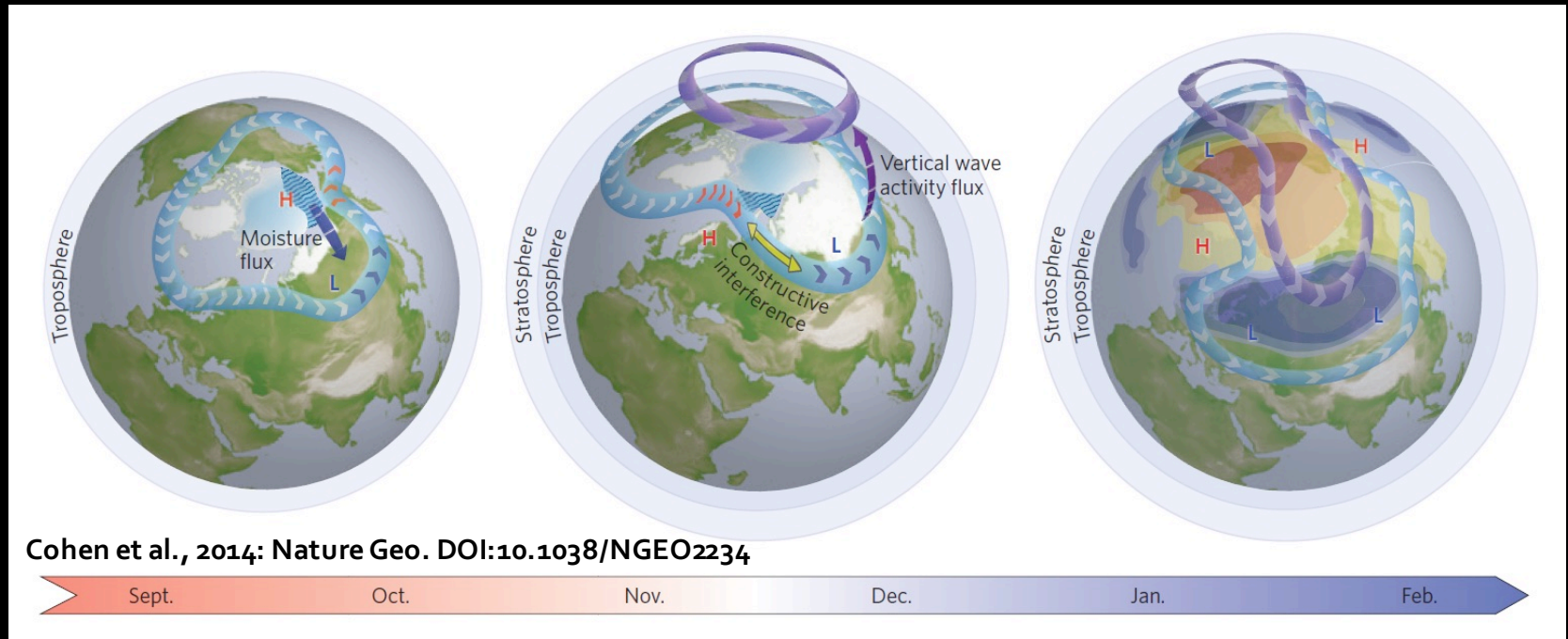


Using 29 years of data from Landsat satellites, researchers at NASA have found extensive greening in the vegetation across Alaska and Canada. (Cindy Starr / NASA's Goddard Space Flight Center)



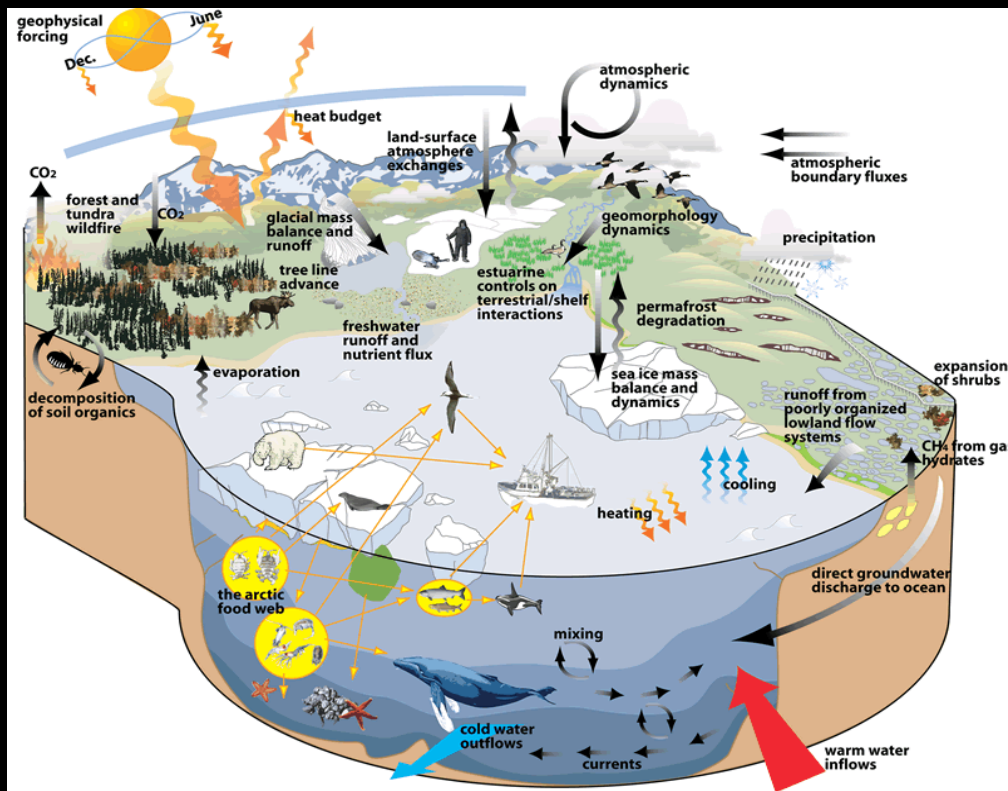
Irina Overeem stands on the rapidly eroding coastline near Drew Point, northern Alaska. Photo by Robert Anderson. <https://instaar.colorado.edu>

# MID-LATITUDES IMPACTS



- Sea-ice loss in the Chukchi and East Siberian seas and an Increase in Eurasian snow cover impact mid-tropospheric geopotential heights
- Increase vertical propagation of Rossby waves from the troposphere into the stratosphere; Weakens the polar vortex; ridging over the Arctic
- Warmer conditions prevail in the Arctic regions
- Colder and more severe winter weather occurs across the mid-latitude continents of the Northern Hemisphere; also persistent ridging





# Arctic Climate System

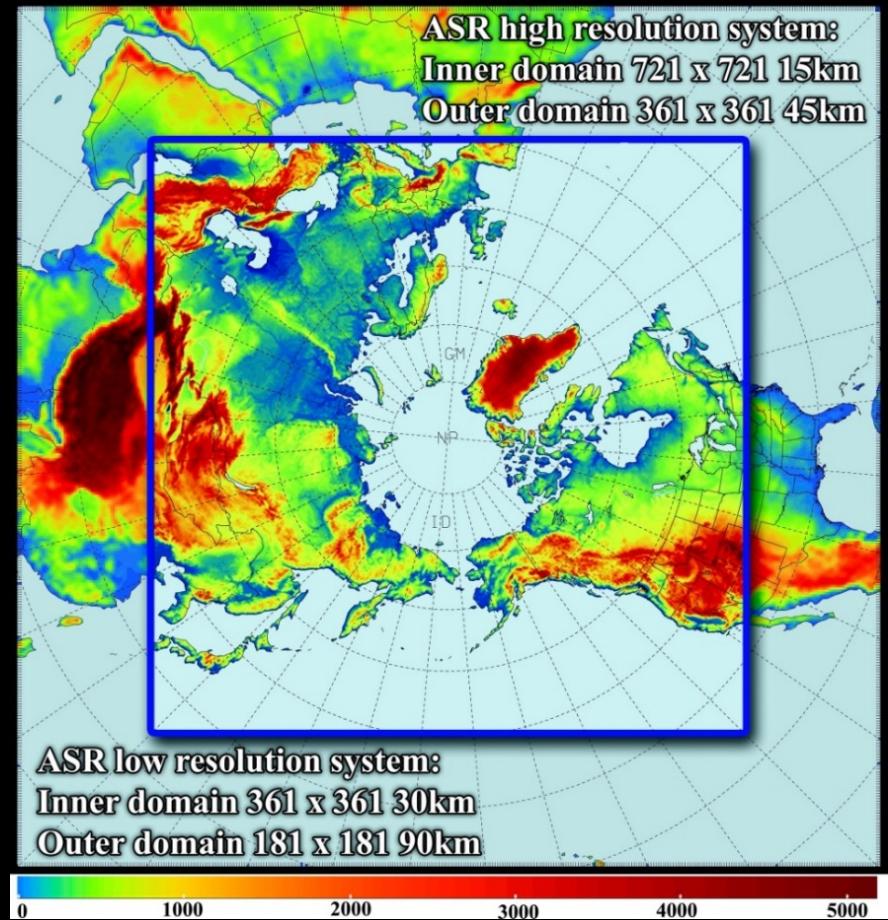
- *Complex Interactions*
- *Rapidly Changing*
- *Amplified* warming with multiple feedbacks

## What is needed?

- *Comprehensive* picture of the changing Arctic climate
- Improved *temporal and spatial resolution* over existing global reanalyses
- *A system-oriented approach* focusing on the atmosphere, land surface and sea ice

# Arctic System Reanalysis

- Regional reanalysis of the Greater Arctic (2000-2012)
  - Includes major Arctic rivers and NH storm tracks
- Uses Polar WRF with WRFDA (3D-VAR)
- Two Versions
  - ASRv1-30km & ASRv2-15 km
  - 71 Vertical Levels (1<sup>st</sup> level – 4m)
  - 3h output

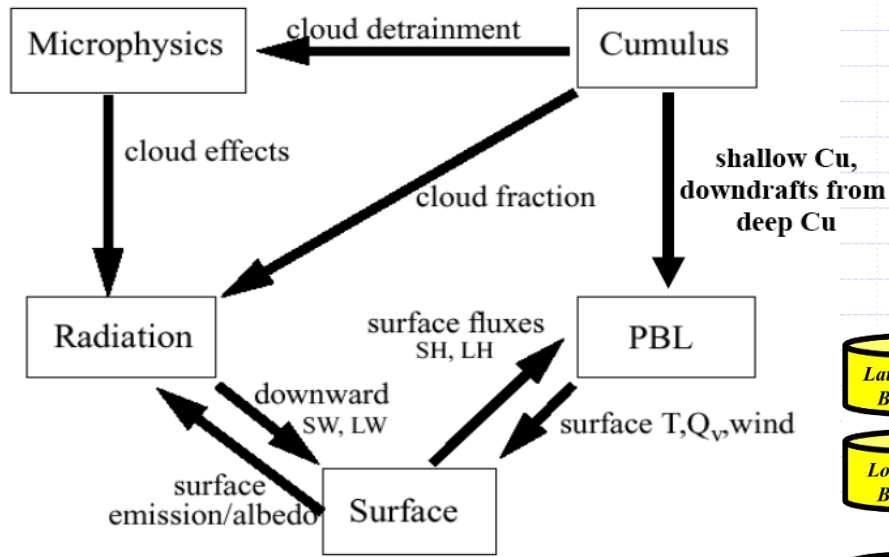


ASRv1: Bromwich et al. 2016 QJRMSS  
ASRv2: Bromwich et al. 2017 BAMS (in prep)

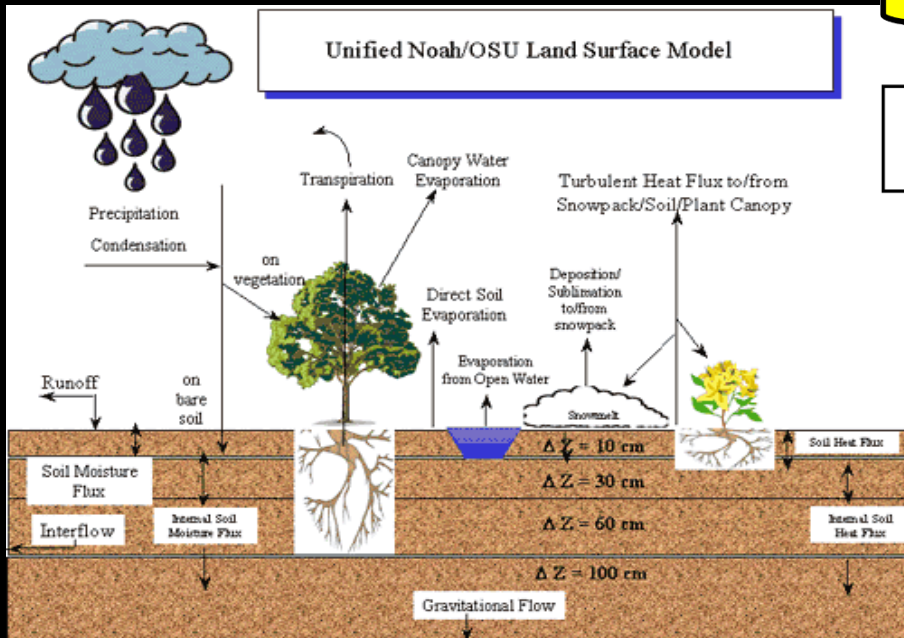
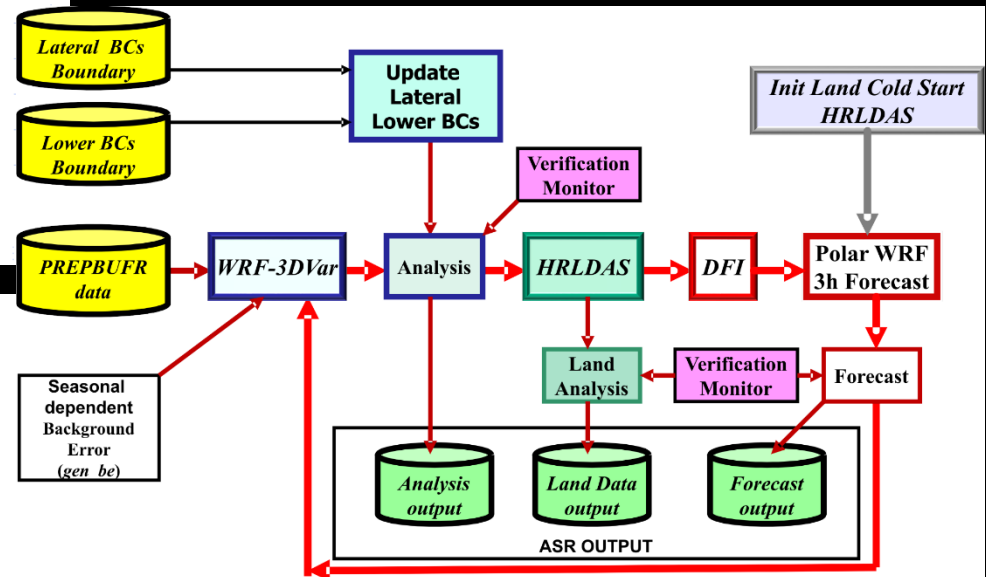
**ASRv1 30 km and ASRv2 15 km available online at the  
NCAR CISL Research Data Archive**



# Polar Weather Research and Forecasting Model (Polar WRF)



# ASR Components

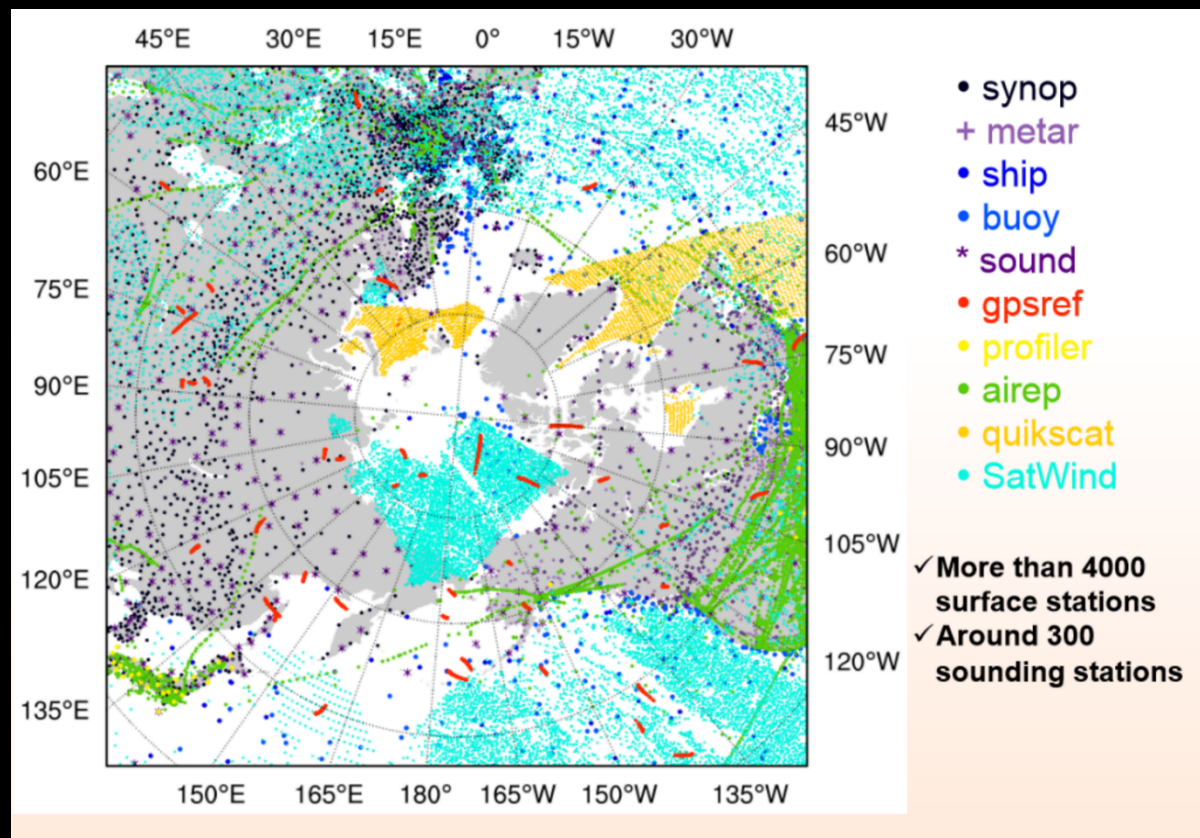
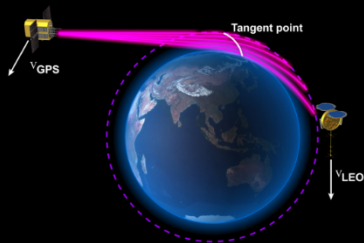
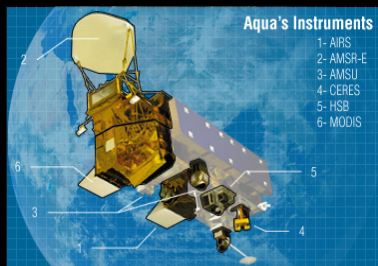
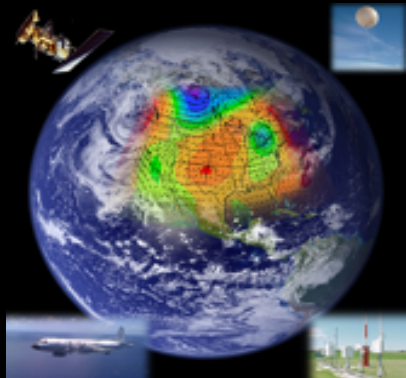


# Polar WRF (versions 3.1-3.8.1)

- Improved treatment of heat transfer for ice sheets and revised surface energy balance calculation in the Noah LSM
- Comprehensive sea ice description in the Noah LSM including:
  - Sea ice fraction specification (mosaic method) – works with MYNN surface boundary layer
  - Specified variable sea ice thickness (ASR-inspired)
  - Specified variable snow depth on sea ice (ASR-inspired)
  - Sea ice albedo seasonal specifications (ASR-inspired)
- Improved cloud microphysics for polar regions – ongoing



# Atmospheric Data Assimilation in ASR with WRFDA (3D-Var)



**Snapshot of Available Data on  
December 1, 2007 within a 3hr  
window**

# OSC Resource Utilization for ASRv2 (15 km)

## ASR High Resolution Data Assimilation with 3hr Cycling Mode Based on 2048 Cores (15km, 71 layers)

| Run Time                 | CPU (wall clock)/RU                               |  | Storage (TB)      |                     |
|--------------------------|---|--|-------------------|---------------------|
| 13 years<br>(2048 cores) | ASR data assimilation<br>(Polar WRF WRFDA HRLDAS) |  | Pressure<br>level | Observation<br>data |
|                          | 120 days  |  | 60                | 30                  |
|                          | 120 days  |  | 190 TB            |                     |





# December 2006 – November 2007 (3 h comparison)

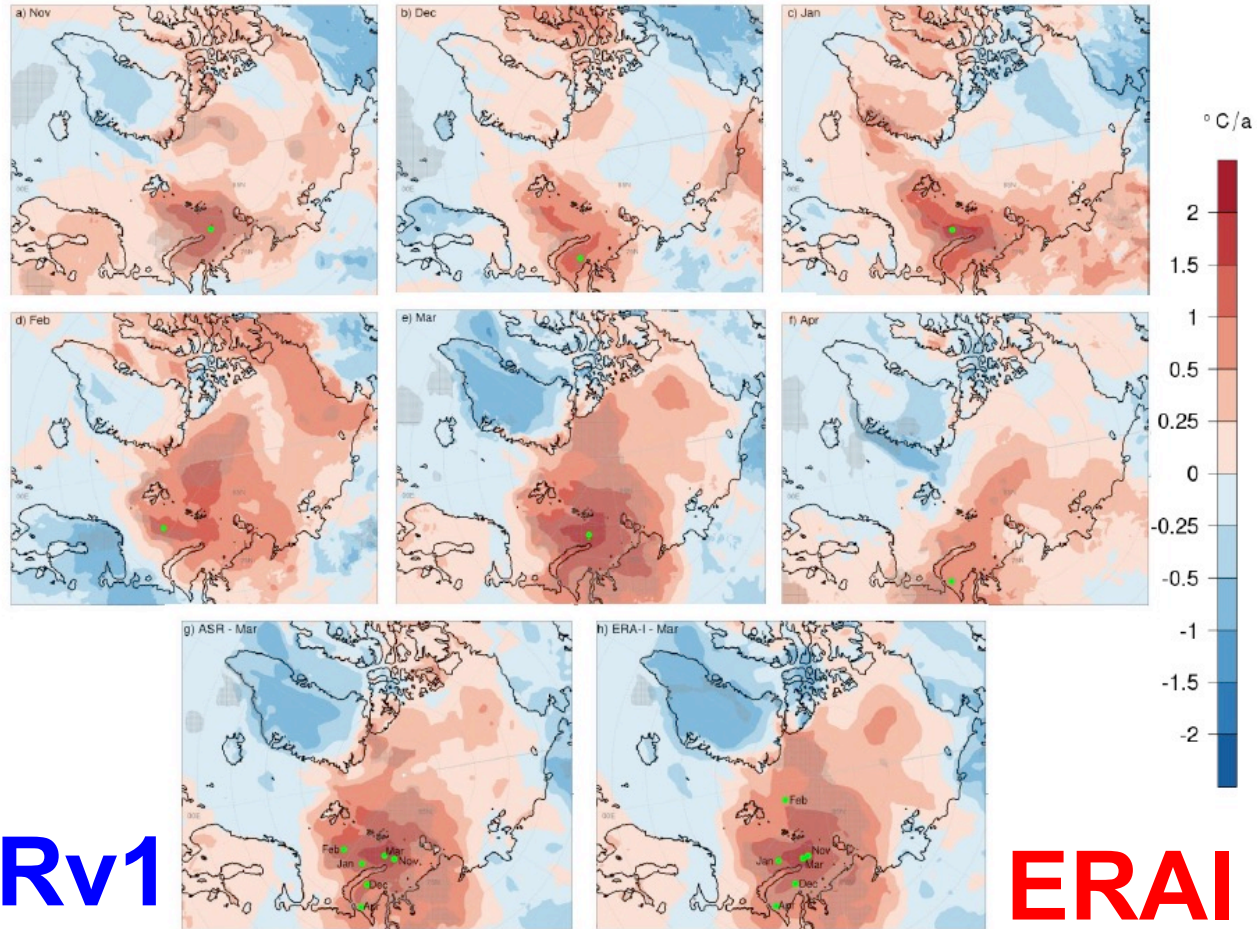
## Surface

| Name               | 2 m Temperature (°C)   |      |             | 2 m Dewpoint (°C)                    |      |             |
|--------------------|------------------------|------|-------------|--------------------------------------|------|-------------|
|                    | Bias                   | RMSE | Correlation | Bias                                 | RMSE | Correlation |
| ERA-I              | 0.29                   | 1.99 | 0.92        | 0.32                                 | 2.04 | 0.88        |
| ASRv1              | 0.10                   | 1.33 | 0.96        | -0.02                                | 1.72 | 0.92        |
| ASRv2              | -0.04                  | 1.08 | 0.97        | 0.22                                 | 1.51 | 0.94        |
| Over<br>4000 stns. | Surface Pressure (hPa) |      |             | 10 m Wind Speed (m s <sup>-1</sup> ) |      |             |
|                    | Bias                   | RMSE | Correlation | Bias                                 | RMSE | Correlation |
| ERA-I              | -0.03                  | 0.98 | 0.99        | 0.41                                 | 2.13 | 0.64        |
| ASRv1              | 0.03                   | 0.83 | 0.99        | -0.24                                | 1.78 | 0.70        |
| ASRv2              | -0.03                  | 0.70 | 0.99        | 0.24                                 | 1.40 | 0.80        |

- Very small 2 m temperature and dewpoint biases in ASRv2 with much improved RMSE over ERA-I
- Large scale synoptic patterns well captured – great match with ERA; very high skill in surface pressure
- Small 10 m wind speed biases – 20% more variance captured by ASRv2 than ERA-I

# ASR and Air Temperature Trends

**ASRv1**



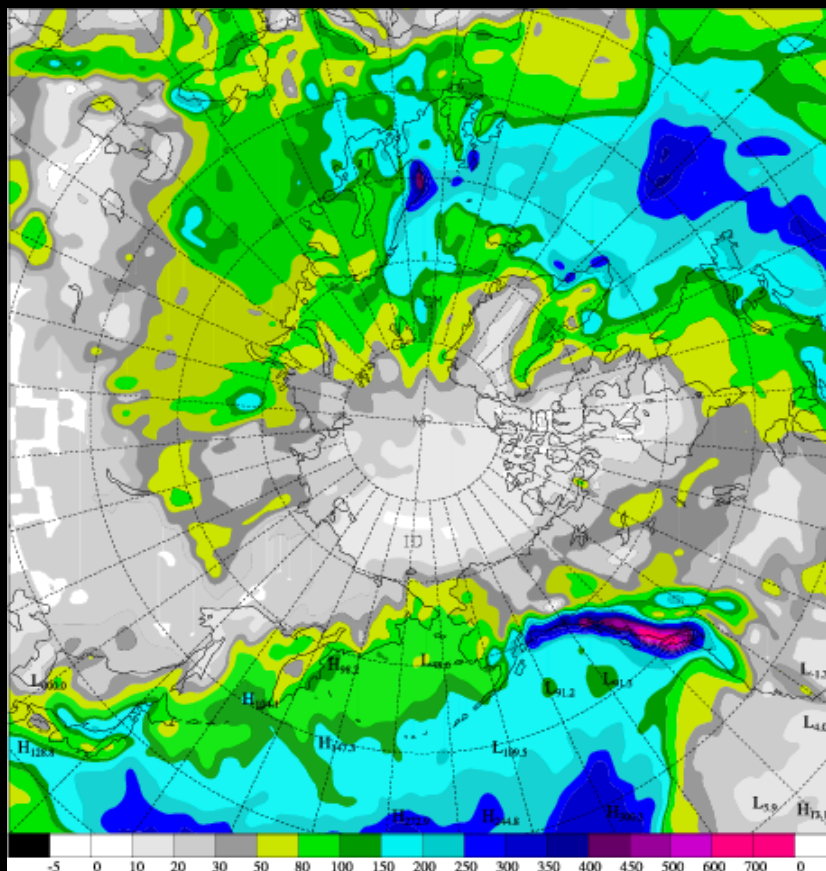
**ERA-I**

Kohnemann et al., 2017: *J. Climate*, accepted.

FIG. 6. Spatial trends of the 2-m air temperature for CCLM monthly mean winter months for 2002 to 2012 (a-f). Gray shaded regions indicate 95% significance. Spatial trends of ASR (g) and ERA-I (h) for Marches 2002 to 2012. The green dots show the region of the maximum trend for the individual months.

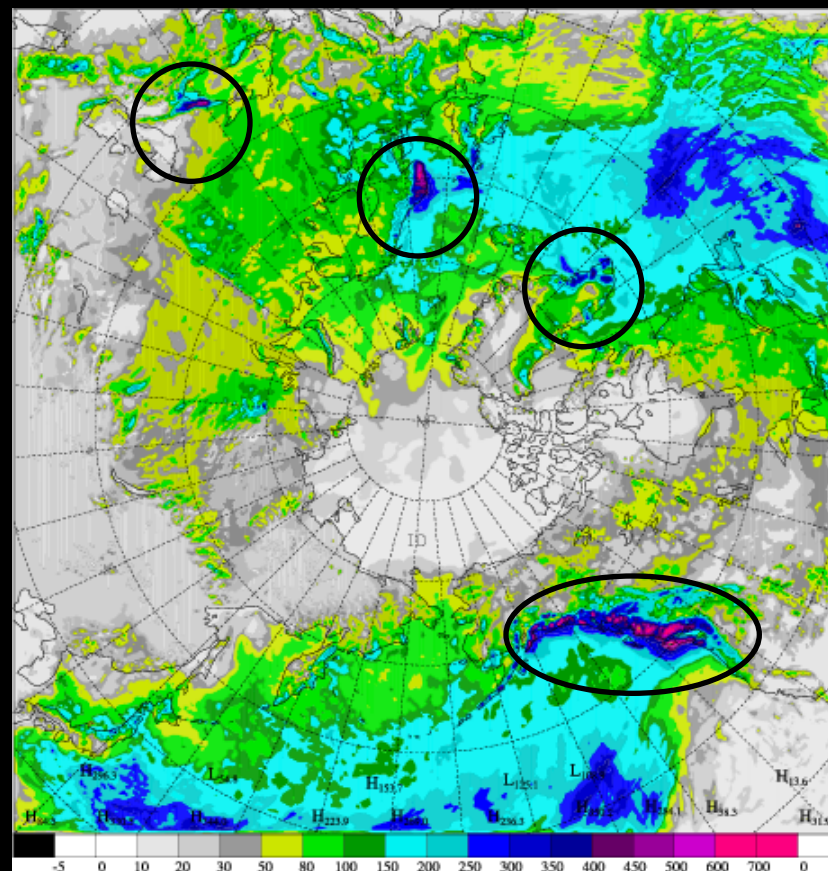


# Precipitation



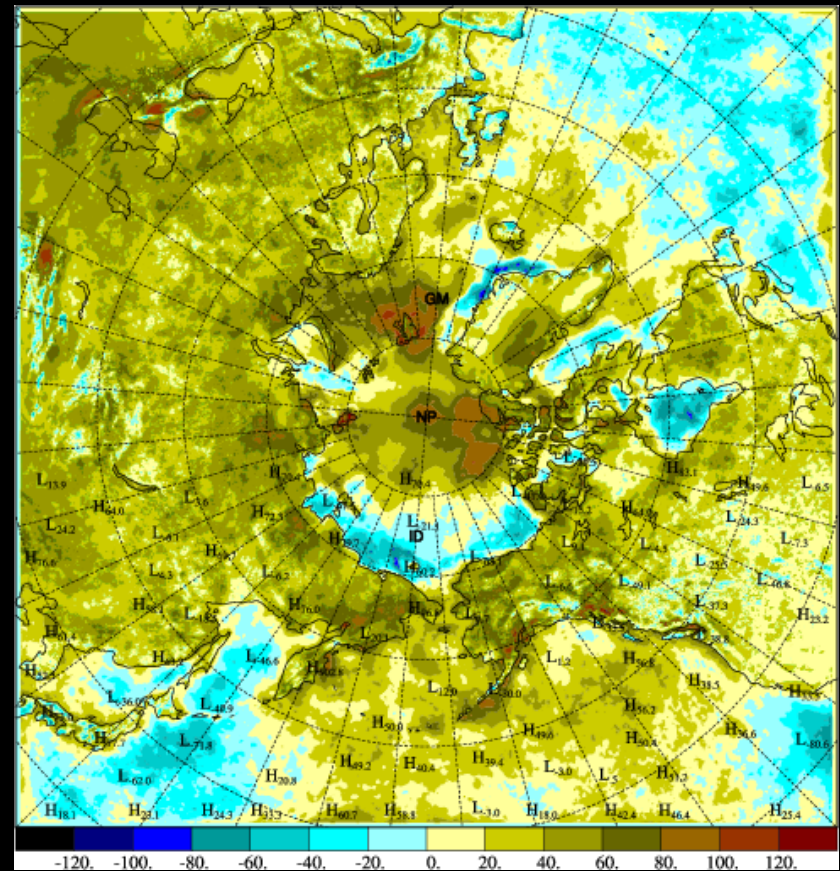
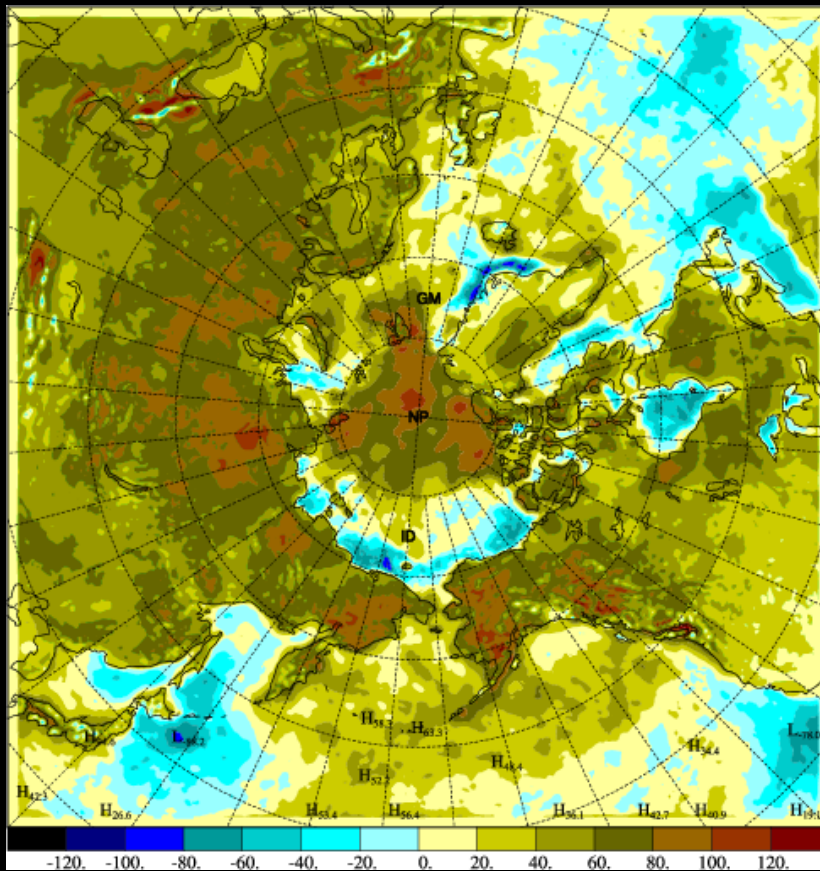
**ERA-I**

**January 2007**



**ASRv2**

| Precipitation          | Midlatitudes (299 stns) |       |       | Polar (75 stns) |       |       |
|------------------------|-------------------------|-------|-------|-----------------|-------|-------|
| % Bias                 | ERA-I                   | ASRv1 | ASRv2 | ERA-I           | ASRv1 | ASRv2 |
| Annual (Dec 06-Nov 07) | -2.7                    | 2.0   | -4.9  | -2.5            | -7.8  | -6.4  |
| Cold (Sep-Feb)         | -4.3                    | -6.2  | -12.5 | -1.5            | -3.2  | -6.5  |
| Warm (Mar-Aug)         | -3.0                    | 9.5   | 1.2   | -0.9            | -10.5 | -4.5  |



# ASRv1-ERAI

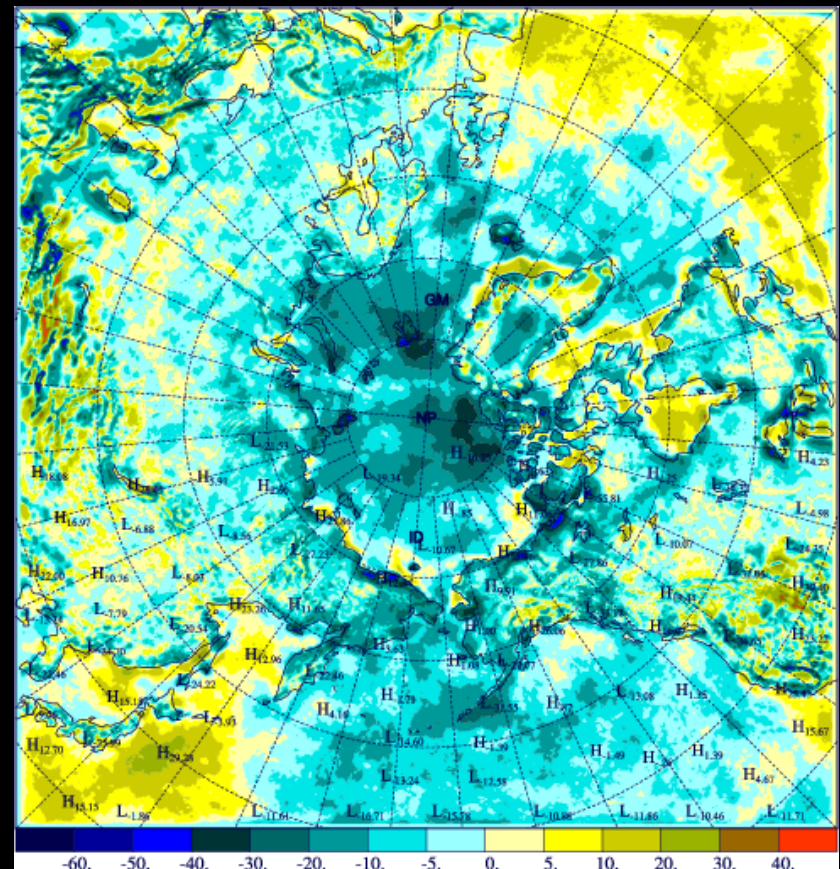
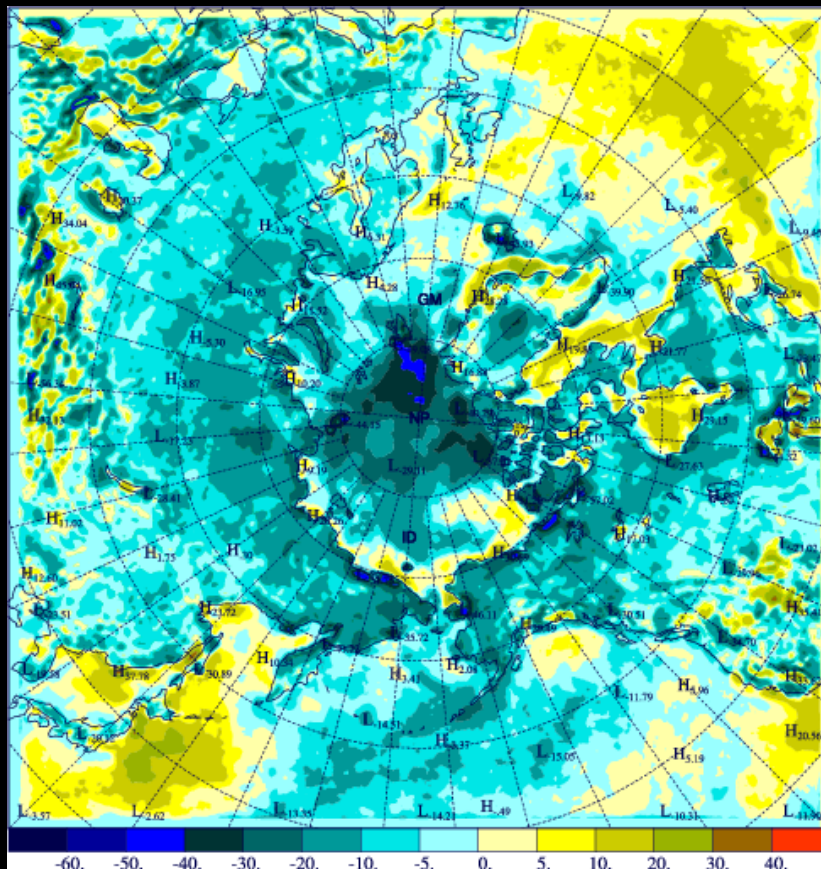
# June 2007

# ASRv2-ERAI

| Incident SW vs BSRN        | Midlatitudes (5 stns) |       |       | Polar (6 stns) |       |       |
|----------------------------|-----------------------|-------|-------|----------------|-------|-------|
| Annual (Dec 06-Nov 07)     | ERA-I                 | ASRv1 | ASRv2 | ERA-I          | ASRv1 | ASRv2 |
| Bias ( $\text{W m}^{-2}$ ) | 14.6                  | 42.0  | 27.0  | -6.7           | 17.6  | 14.8  |
| RMSE                       | 118.8                 | 104.6 | 95.3  | 55.6           | 53.8  | 55.4  |
| Correlation                | 0.83                  | 0.92  | 0.92  | 0.82           | 0.87  | 0.86  |



# Downwelling Longwave



**ASRv1-ERA**

**June 2007**

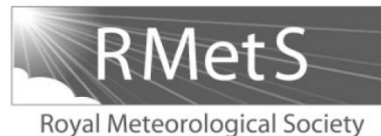
**ASRv2-ERA**

| Downwelling LW vs BSRN    | Midlatitudes (5 stns) |       |       | Polar (6 stns) |       |       |
|---------------------------|-----------------------|-------|-------|----------------|-------|-------|
| Annual (Dec 06-Nov 07)    | ERA                   | ASRv1 | ASRv2 | ERA            | ASRv1 | ASRv2 |
| Bias (W m <sup>-2</sup> ) | -8.8                  | -11.4 | -6.8  | -5.9           | -11.8 | -13.9 |
| RMSE                      | 23.5                  | 26.3  | 24.9  | 27.8           | 34.0  | 34.6  |
| Correlation               | 0.80                  | 0.77  | 0.78  | 0.66           | 0.59  | 0.61  |

# Topographically-Forced Winds

Quarterly Journal of the Royal Meteorological Society

*Q. J. R. Meteorol. Soc.* 141: 000–000, April 2016 B DOI:10.1002/qj.2798



## Arctic System Reanalysis improvements in topographically forced winds near Greenland

G. W. K. Moore,<sup>a\*</sup> David H. Bromwich,<sup>b,c</sup> Aaron B. Wilson,<sup>b</sup> Ian Renfrew<sup>d</sup> and Lesheng Bai<sup>b</sup>

<sup>a</sup>Department of Physics, University of Toronto, Canada

<sup>b</sup>Polar Meteorology Group, Byrd Polar and Climate Research Center, Ohio State University, Columbus, OH, USA

<sup>c</sup>Department of Geography, Ohio State University, Columbus, OH, USA

<sup>d</sup>School of Environmental Sciences, University of East Anglia, Norwich, UK

\*Correspondence to: G. W. K. Moore. E-mail: gwk.moore@utoronto.ca

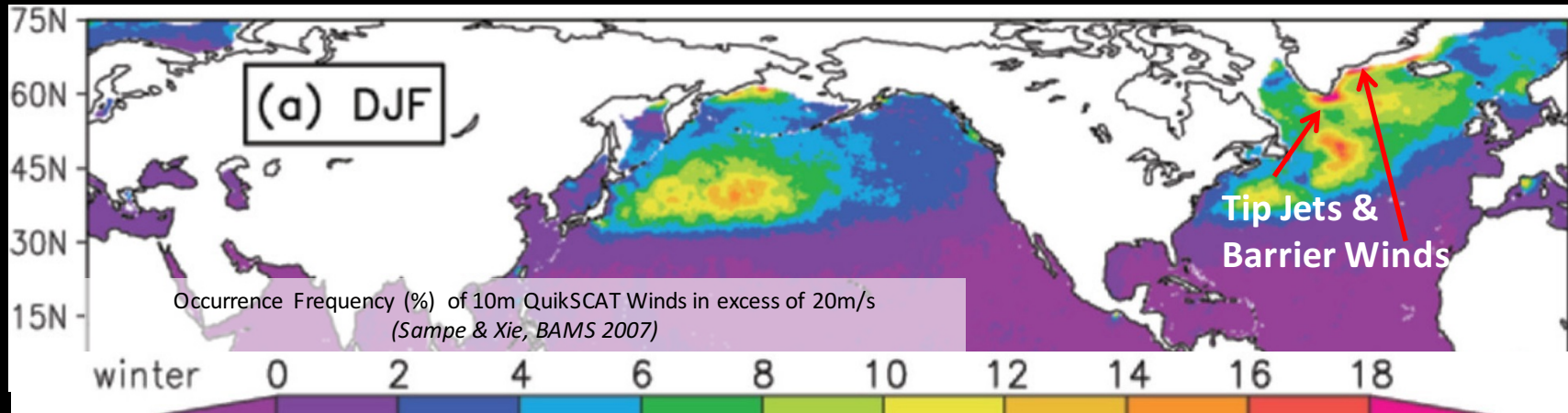


# Greenland's Place in Arctic/Global System



Tracks of 100 most intense winter extra-tropical cyclones 1989-2008 (Courtesy U. of Reading)

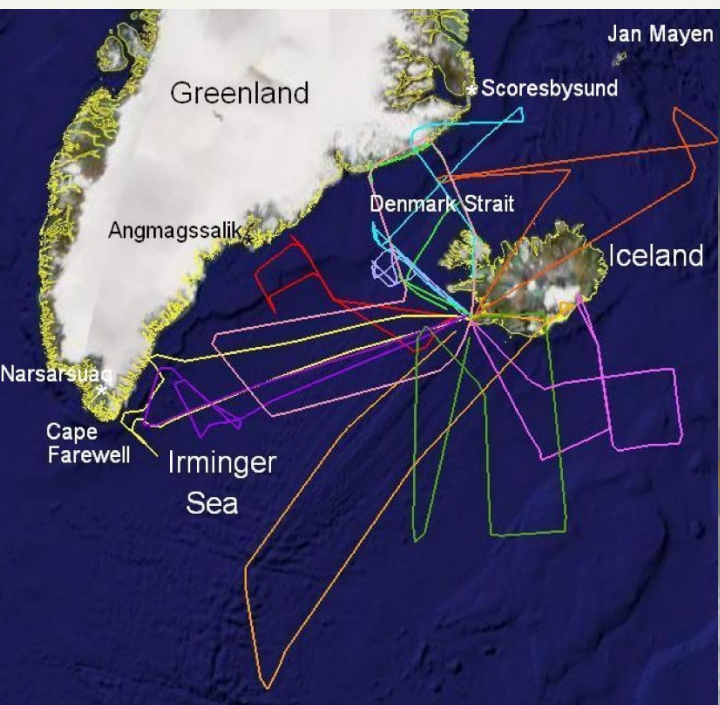
- High complex topography
- Proximity to North Atlantic storm track
- Yield topographically forced weather systems (*tip jets, barrier winds & katabatic flow*)
- Roles in local weather/global climate (sea ice transport, polynyas, ocean circulation)



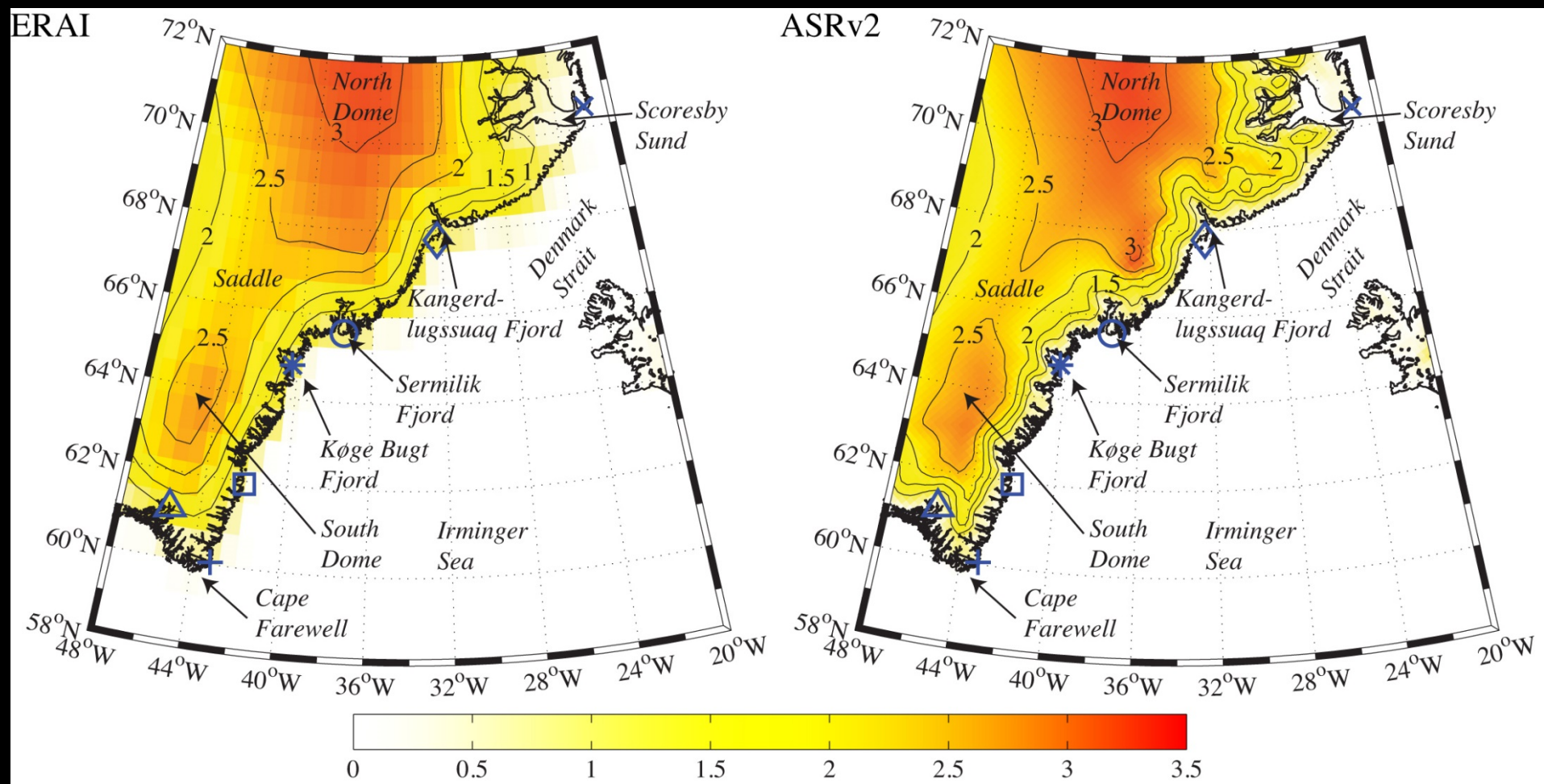




GFDex airborne campaign (Feb-Mar 07)



# Greenland Topography

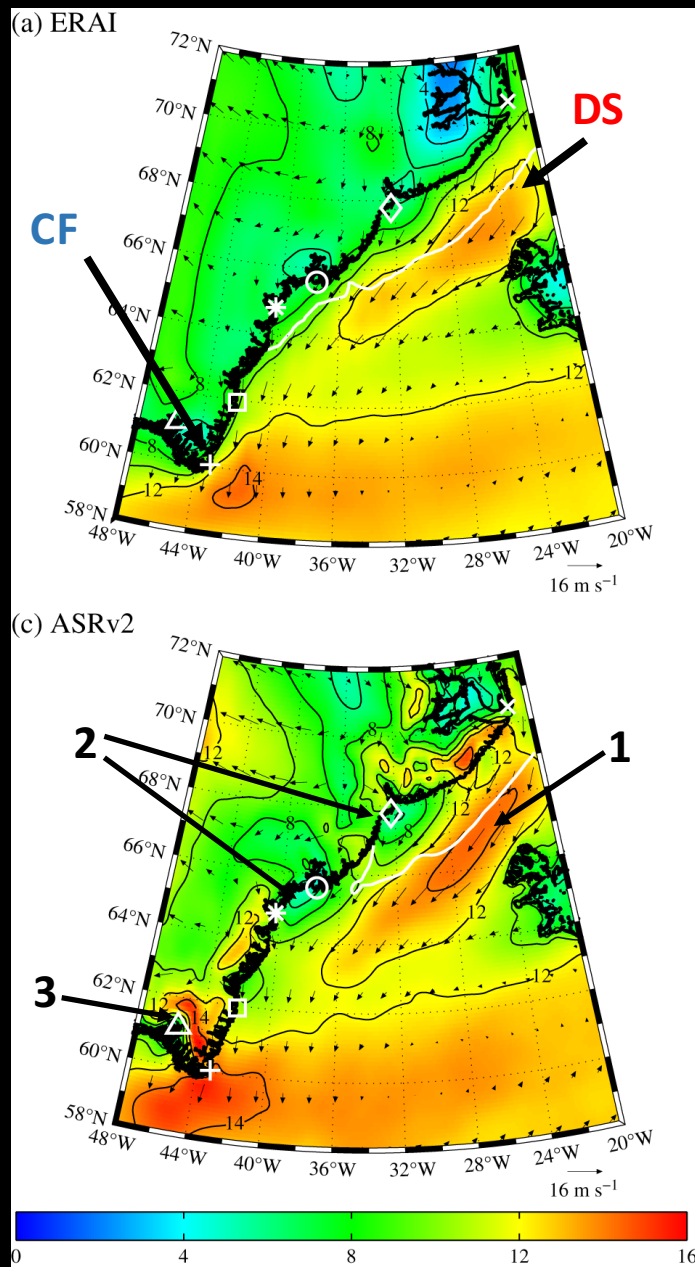


Topography of Southern Greenland (km) as represented in the ERA-I (80km) and ASRv2 (15km)

DMI stations in the region are indicated



# Barrier Flow



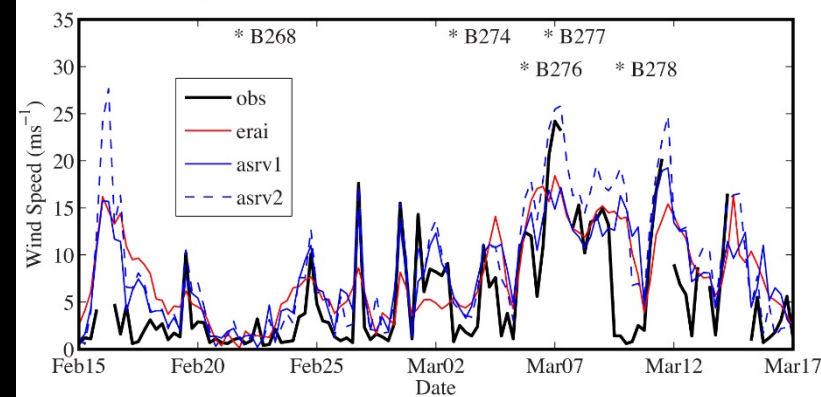
- Both capture enhanced barrier flow along Denmark Strait (DS) and NE flow near Cape Farewell (CF)
- Increased resolution  $\approx$  higher wind speed
- ASR demonstrates
  - Enhanced wind speed gradient along ice edge
  - Low wind speeds downwind of Sermilik and Kangerdlugssuaq Fjords (topographic sheltering effect Moore et al. GRL 2015)
  - Onshore extension of high wind speed near CF



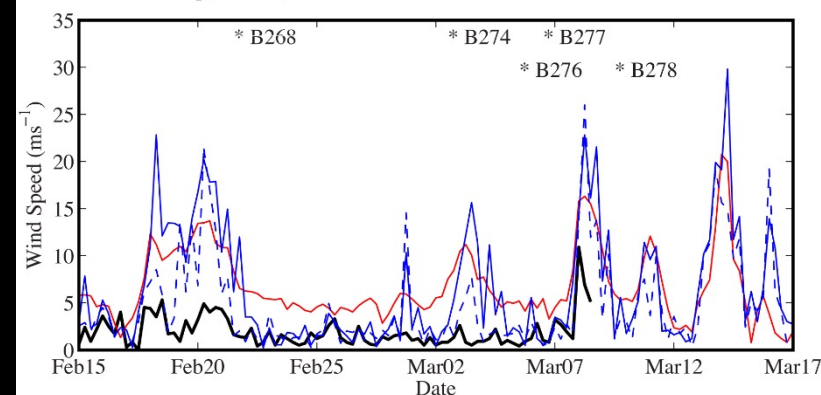
# 10 m Wind Speeds at DMI Sites

- Winds generally stronger in the southern sites during first half
- B268 flight investigated Easterly Tip Jet near Ikerasassuaq (CF); ERAI winds too low – better captured by ASR
- Stronger winds in North during second half
- B274, B276, B277, and B278 captured Barrier Wind Event
- Observed winds at Tasillaq lower than reanalyses (sheltering)

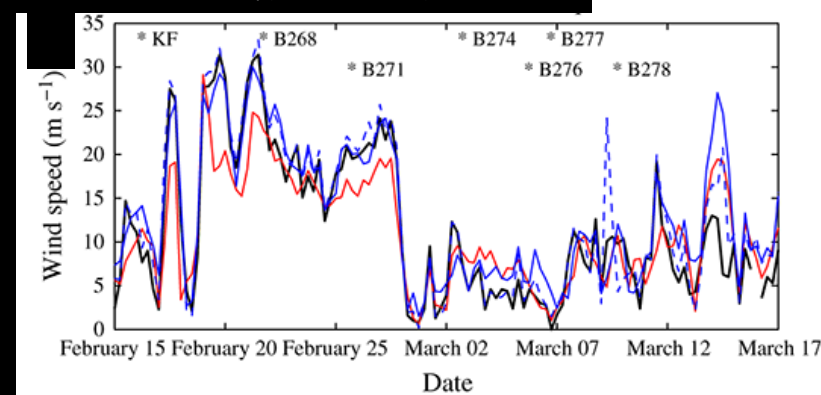
DMI 04339 Scoresby Sund (North)



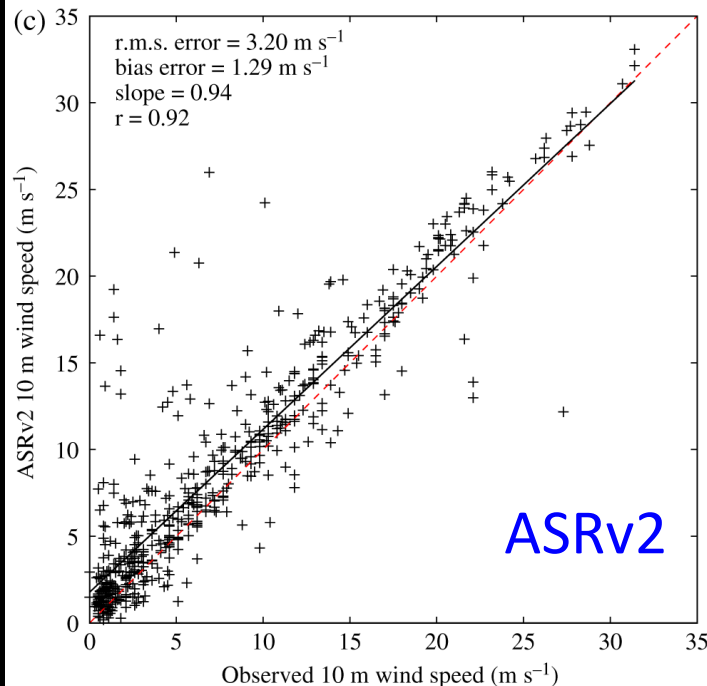
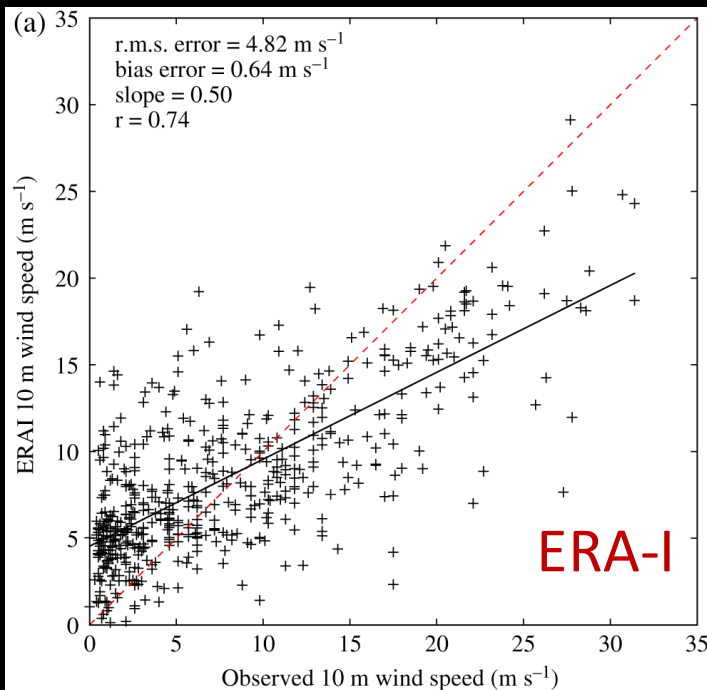
DMI 04360 Tasiilaq (Middle)



DMI 04390 Ikerasassuaq (near CF – South)

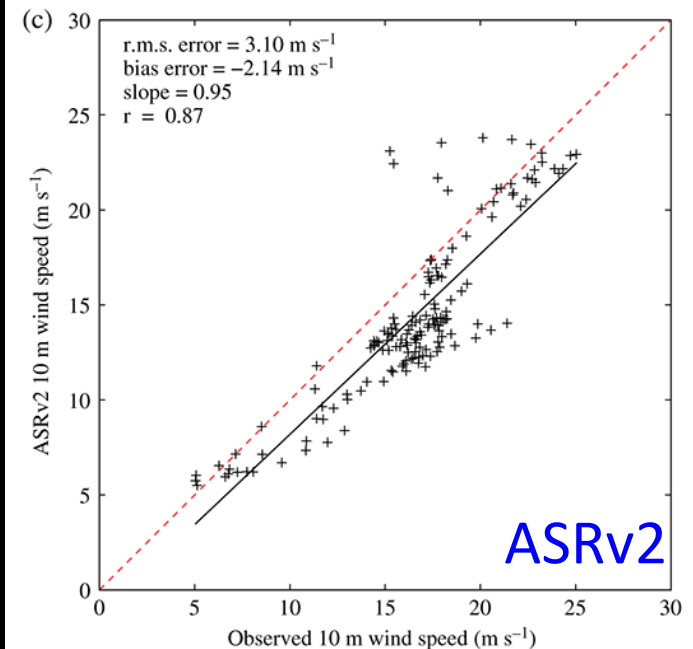
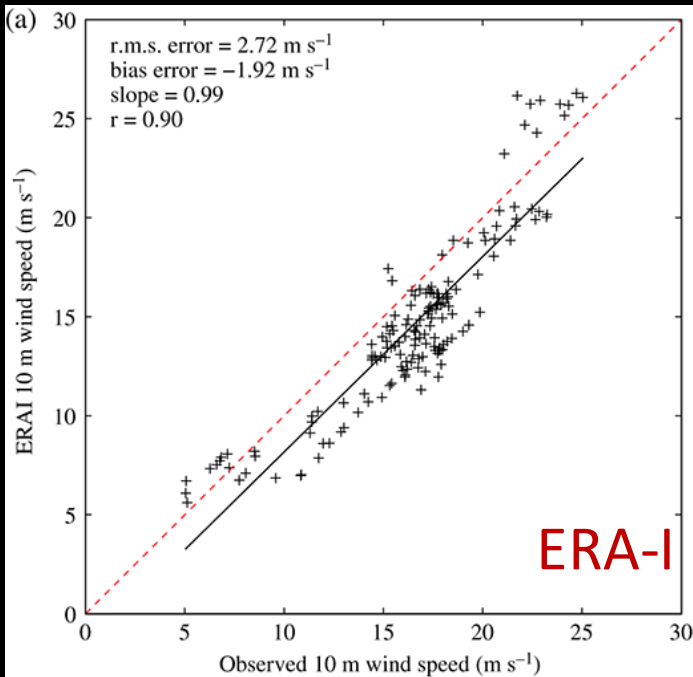


# Scatter Plots of the DMI Stations



- ERAI has high/low wind speed bias that is reduced in the ASRv2.
- Both regression slope and correlation coefficient approach 1 as one transitions from the ERAI to ASRv2.
- ASRv2 still overestimates wind speeds during weak wind regimes – likely tied to the sheltering situations

# Scatter Plots of the GFDex Low-Level Flight Legs

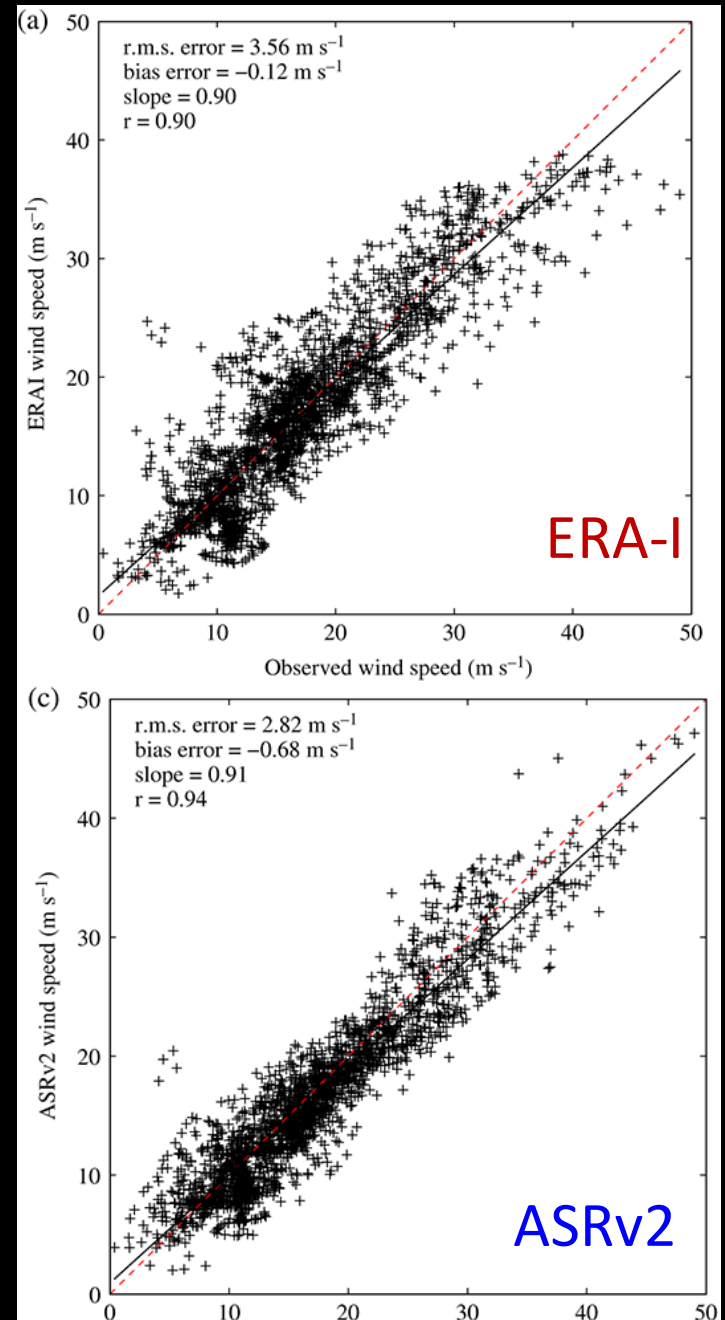


- Both reanalyses have a systematic low wind speed bias
- No significant difference between the ERAI and ASRv2
- There is a reduction in RMSE and increase in correlation between ASRv1 and ASRv2: perhaps better spatial gradients



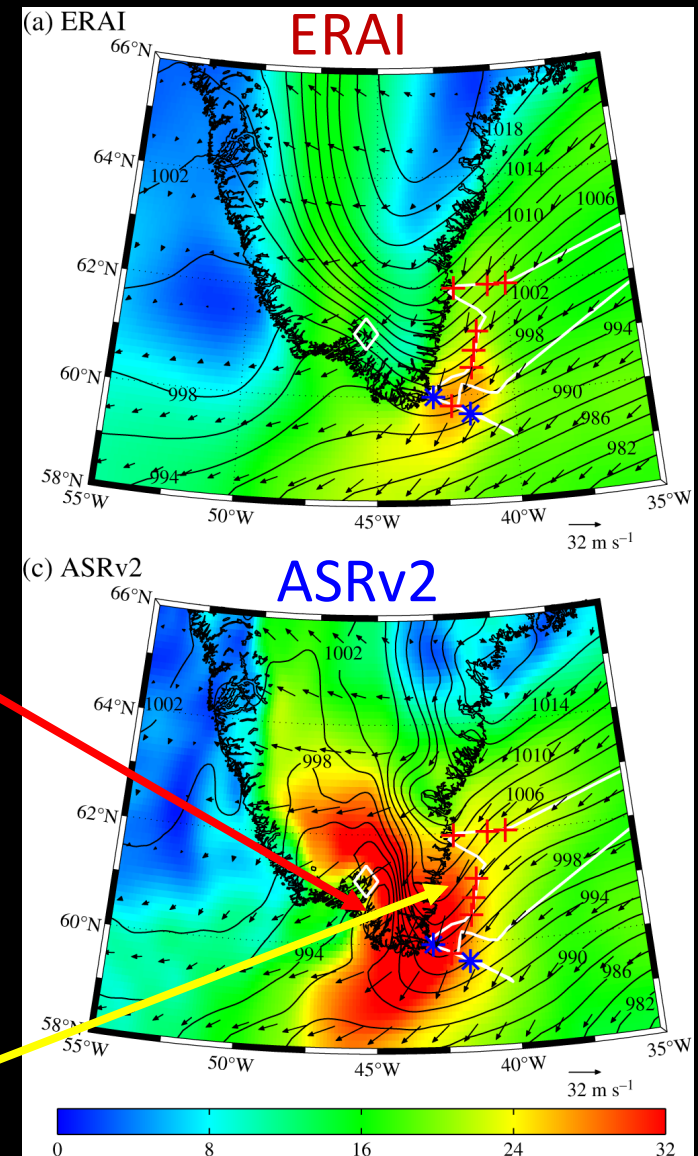
# Scatter Plots of the GFDex Dropsondes

- Both reanalyses are similar with respect to the winds from the GFDex dropsondes
- The ASRv2 does a better job with the high winds ( $> 40 \text{ m s}^{-1}$ ) but these are not numerous enough to influence the statistics.
- Representation of the vertical structure of off shore jets is marginally improved in the ASRv2
- Resolution may play a bigger role near shore



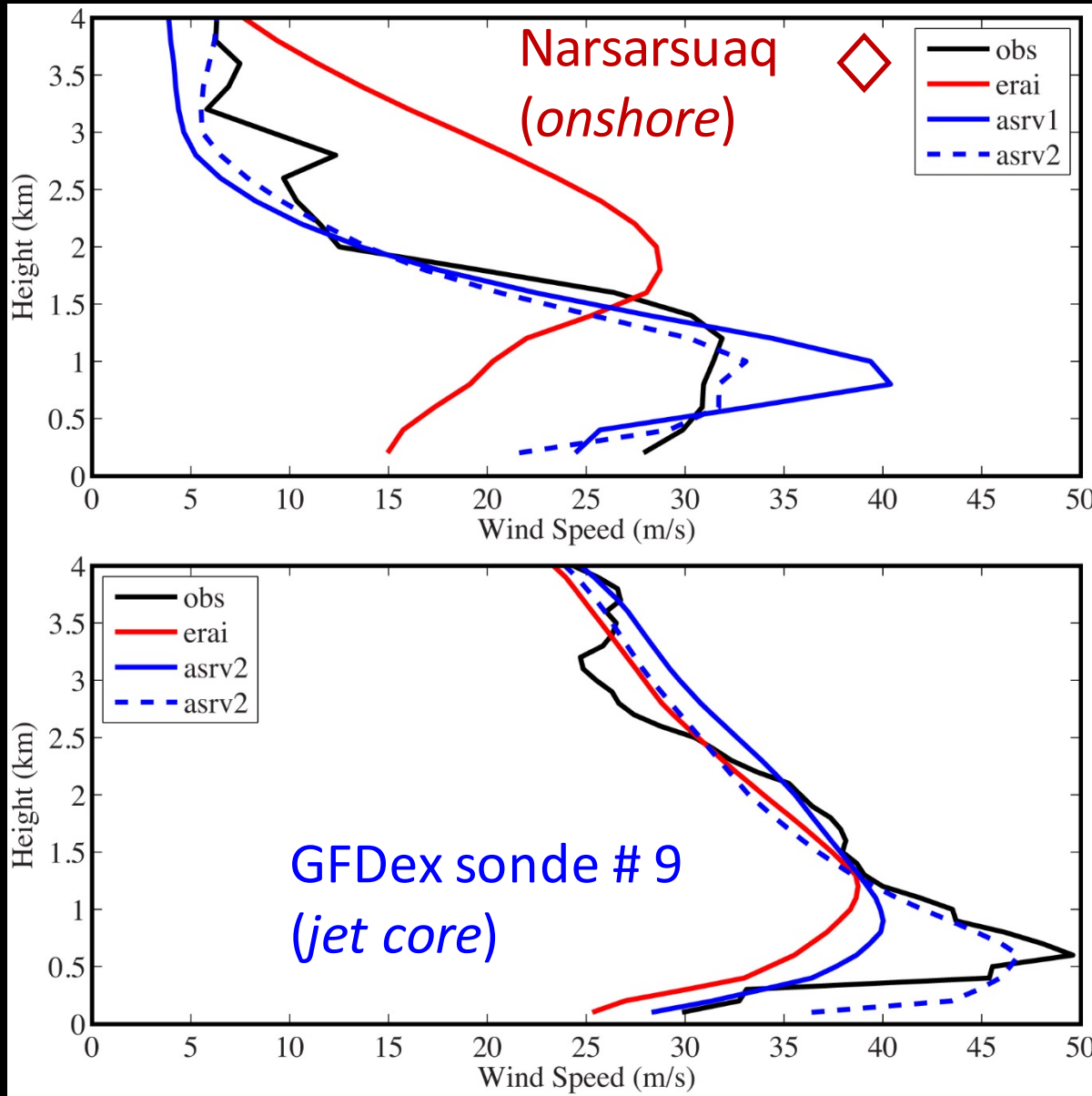
# Easterly Tip Jet

- Synoptic Low SE of CF, region under NE flow, broad scale captured well in reanalyses.
- ASRv2 captures the mesoscale low that forms on the lee side of the barrier as well as generally having higher wind speeds.
- ASRv2 also identifies a new feature of ETJ, onshore extension of the flow that may play a role in erosion and aerosol dispersion.



Sea-level pressure (mb-contours), 10m wind (m/s-vectors) and 10m wind speed (m/s-shading) for the easterly tip jet (ETJ) flight (B268- flight track in white with dropsondes indicated) at 12 UTC on February 21 2007

# Vertical Structure of the ETJ

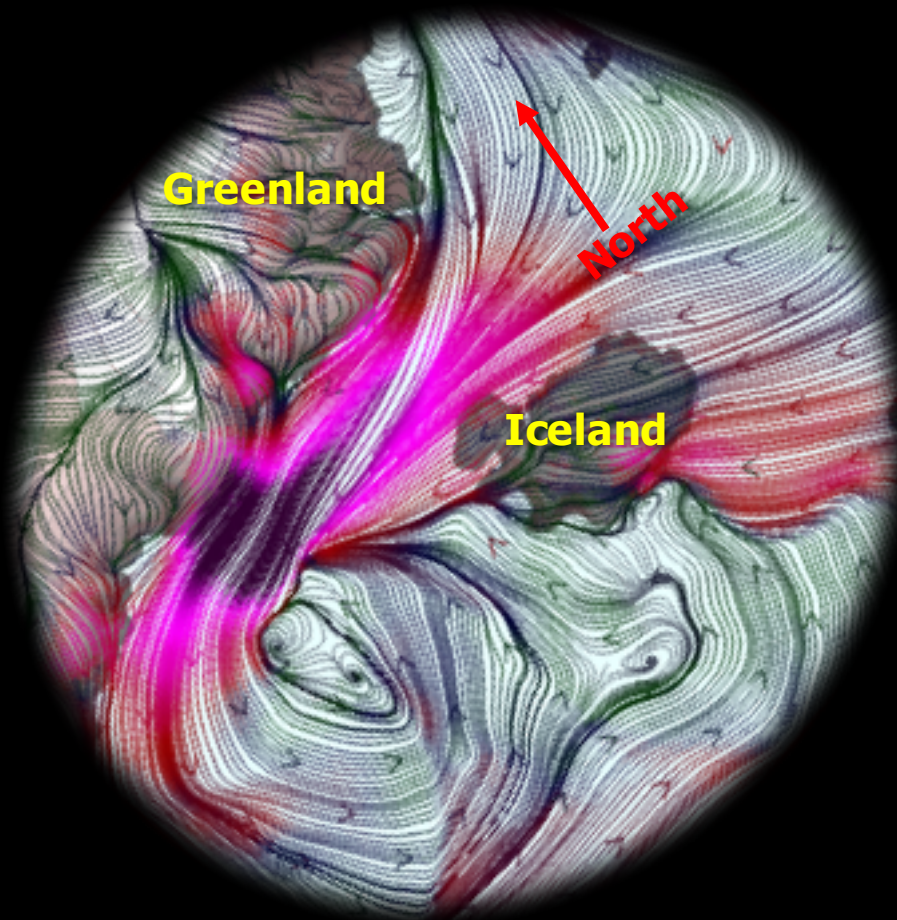


- ERAI missing onshore extension of tip jet
- ASRV2 is able to better represent the onshore and offshore vertical structure of the observed easterly tip jet.

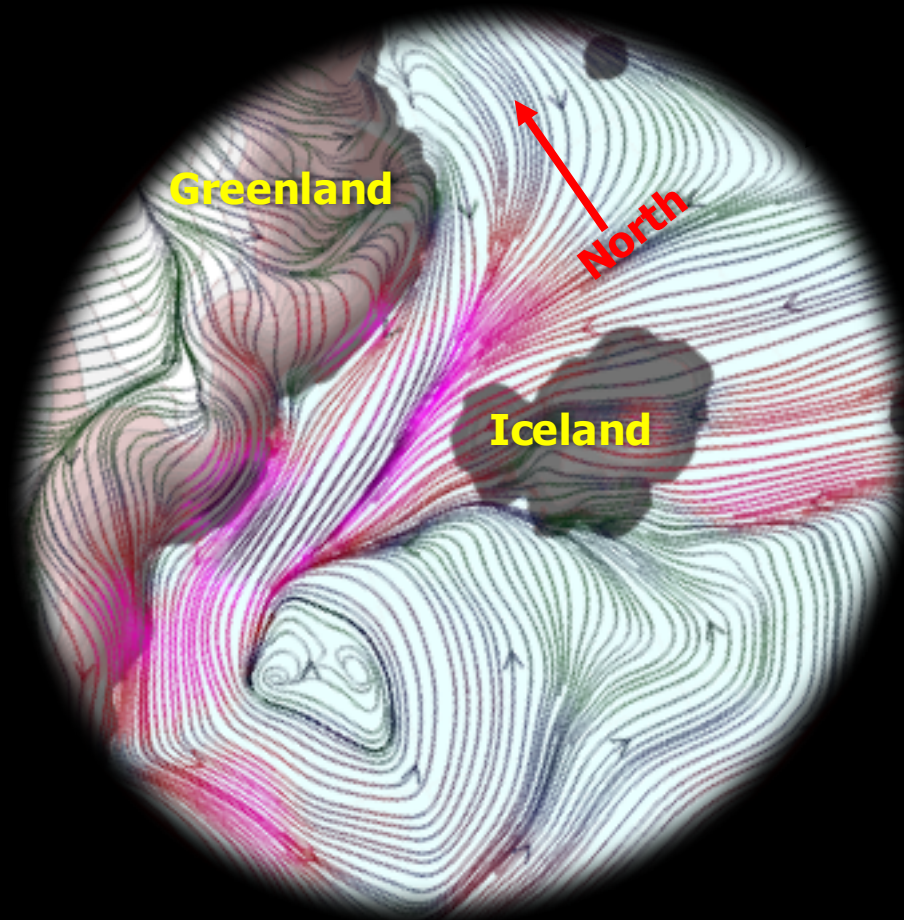
Observed and model wind speed profiles during GFDex flight B268



# Intense Barrier Wind in Denmark Strait @ 15 km



**ASR 15km**



**ASR 30km**

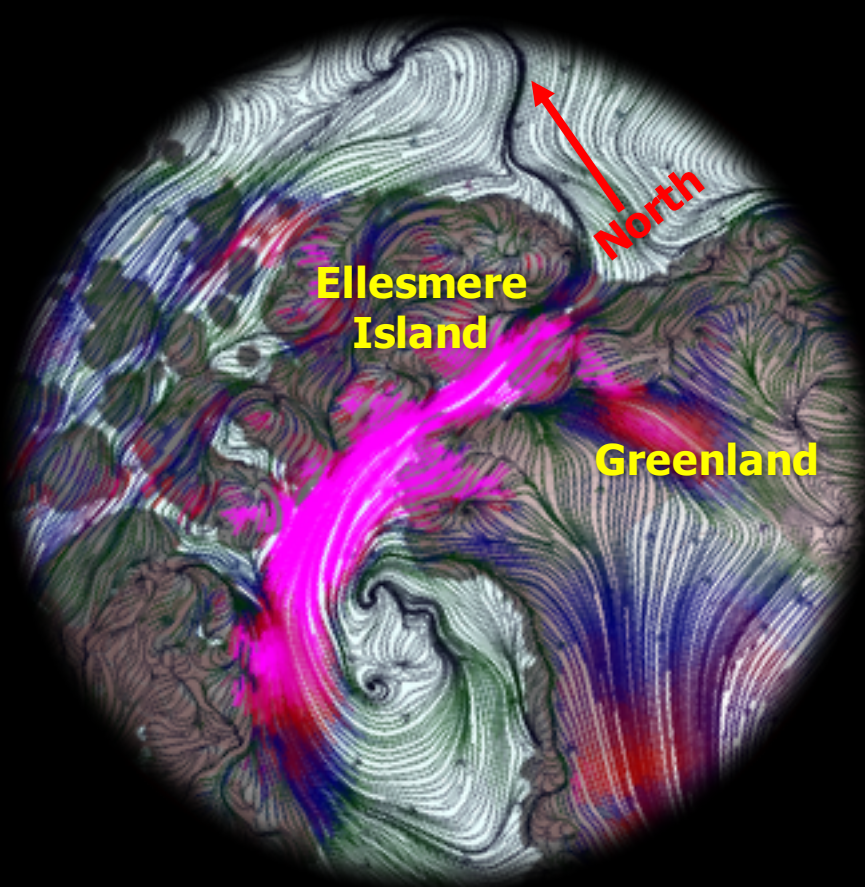


Wind Speed  
m/s

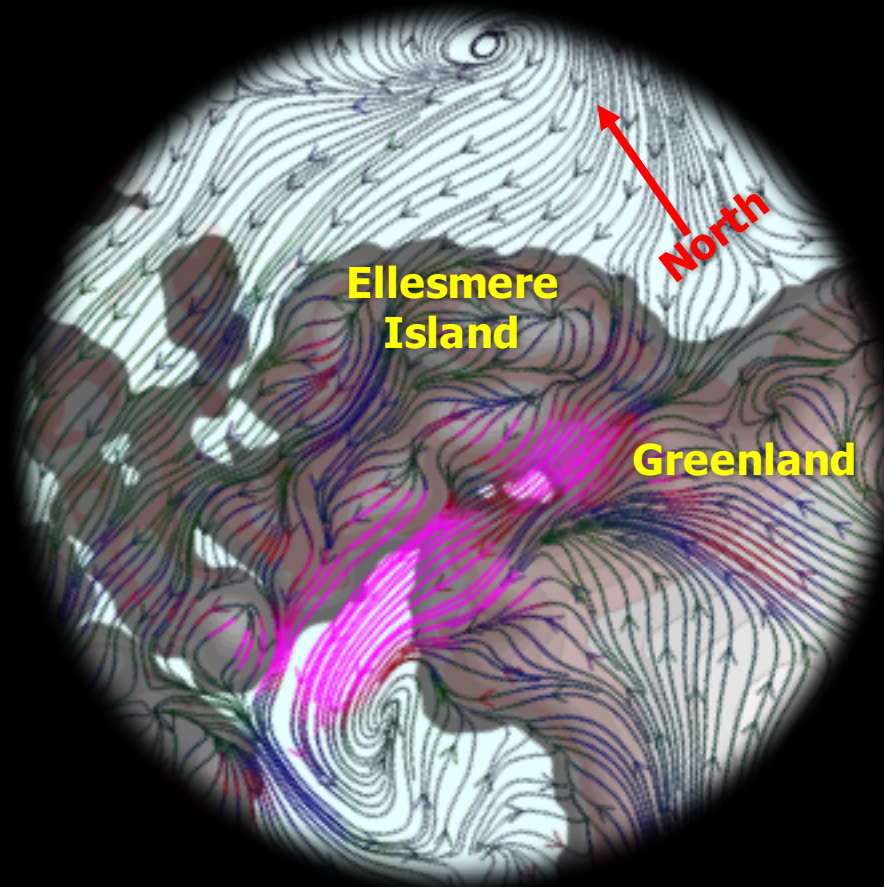
**03UTC Mar 03, 2007**



# Intense Gap Wind in Nares Strait @ 15 km



**ASR 15km**



**ASR 30km**



Wind Speed  
m/s

**03UTC Feb 09, 2007**

# Summary of ASRv2

- **ASRv2 (15 km; 2000-2012) completed; Now available at NCAR CISL!**
- **ASRv2 will be brought up to date in the near future**
- **Surface variables compare very well with surface observations**
  - Marked improvement in skill over ERAI in near-surface temperature, moisture, and especially wind speed
- **Precipitation and Radiation in ASRv2 improved over ASRv1 (30 km)**
  - Decreased excessive summertime precipitation
  - ASRv2 is qualitatively similar to ERAI
  - Positive SW and Negative LW biases are smaller
- **Topographically-forced wind events near Greenland resolved well**

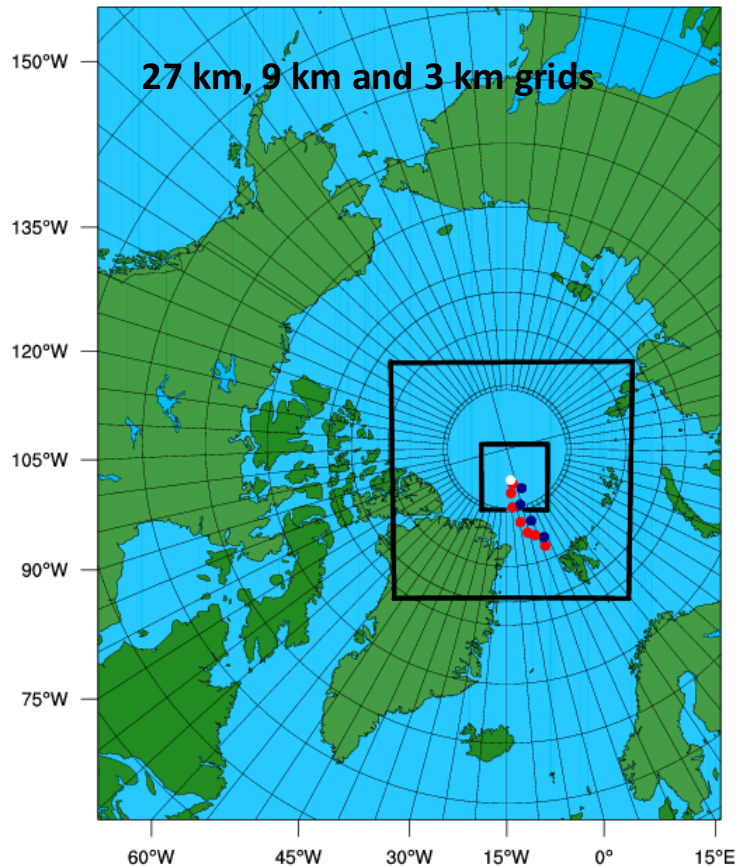


# Next Step: ASRv3

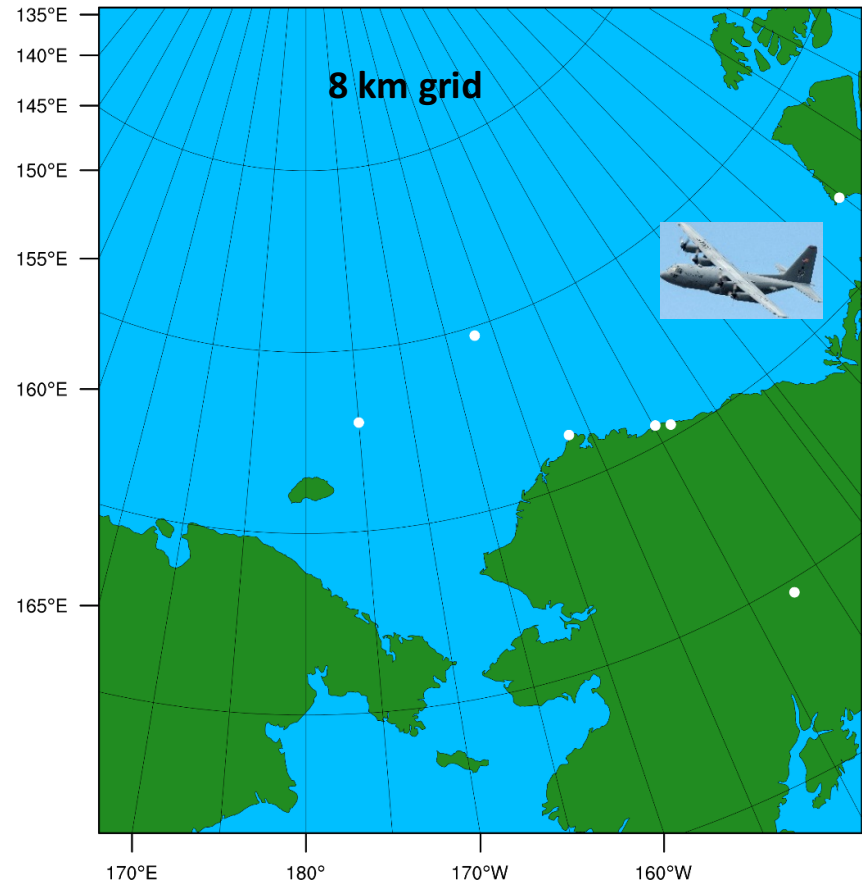
- **Expand the period to 1979-2020**
  - **Spans YOPP and MOSAIC**
- **Upgrades include**
  - **Improved parameterization:** Better Arctic cloud representation, improved radiation, and aerosols
  - **Sophisticated Land Surface model:** Improve snow cover, vegetation, and land-ocean-atmosphere interaction
  - **Advanced data assimilation:** Atmosphere, sea ice, land surface, and Greenland Ice Sheet.
- **Key Intellectual Merit**
  - **Detailed investigations of Pan-Arctic extreme weather and climate**
- **Proposal in review with NSF**

# Arctic Cloud Work – Improvements to Polar WRF

ASCOS August 2008



ARISE September 2014



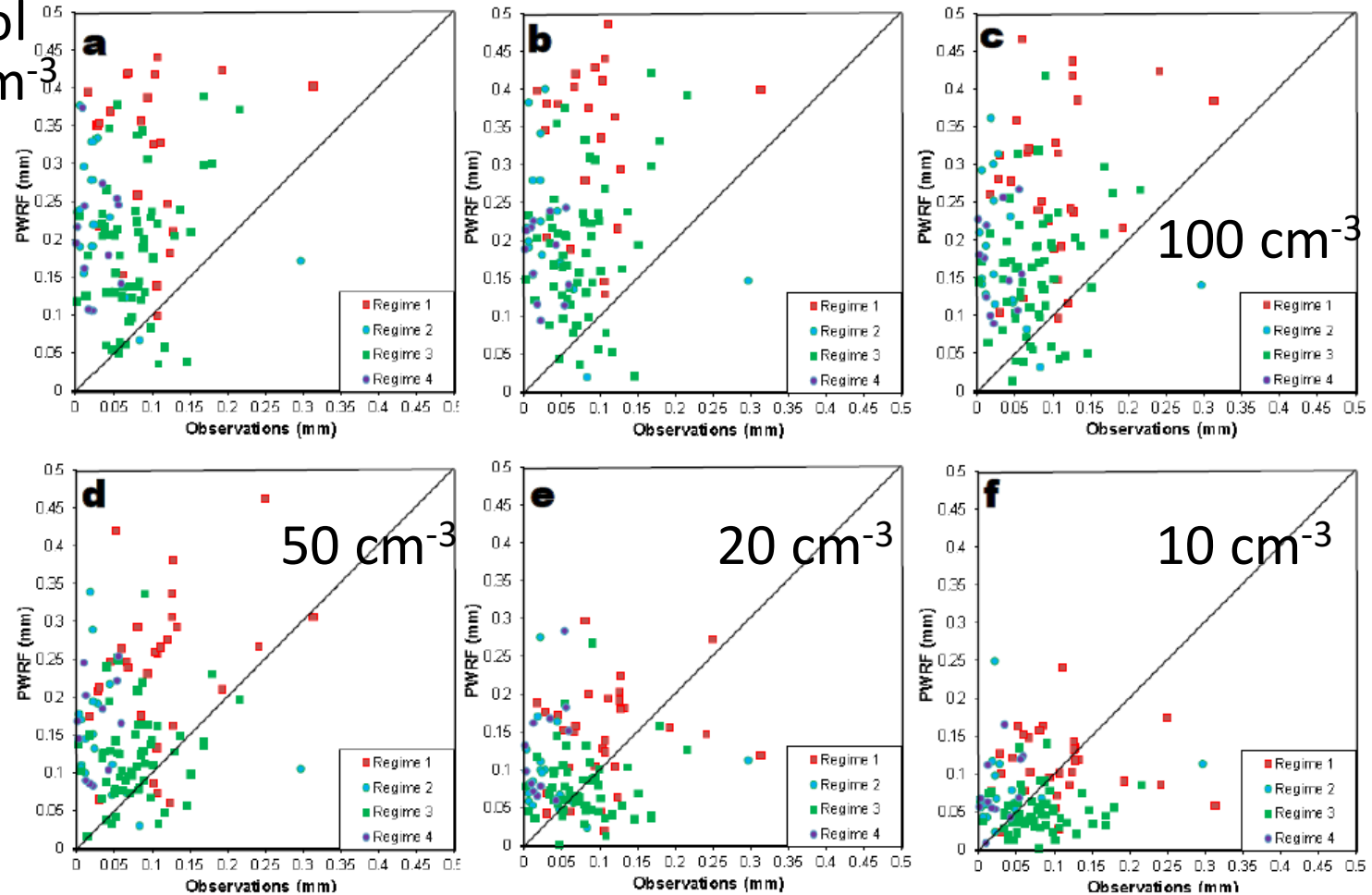
**New Polar WRF simulations to study the model representation of Arctic low-level clouds**

**Hines and Bromwich, 2017: *Mon. Wea. Rev.***

**GREATLY REDUCING the Arctic Cloud Condensation Nuclei (CCN) in  
PWRF CORRECTS the excessive simulated liquid water content in low  
clouds.**

ASCOS has detailed aerosol observations

Control  
250  $\text{cm}^{-3}$

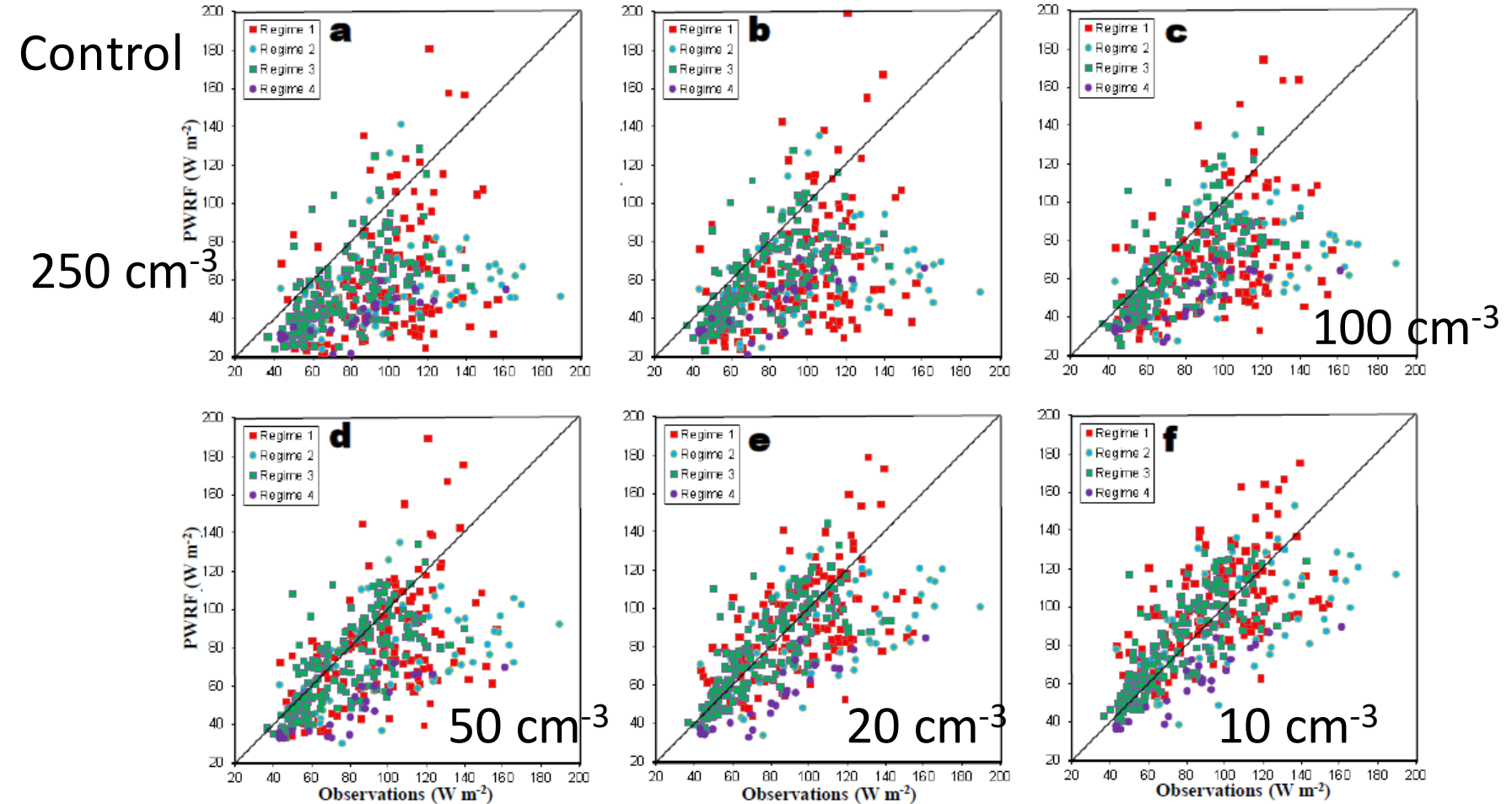


**Figure 15.** Scatter plots of simulated versus hourly cloud liquid water (mm) for (a) Control, (b) Snow Albedo, (c) Morrison 100  $\text{cm}^{-3}$ , (d) Morrison 50  $\text{cm}^{-3}$ , (e) Morrison 20  $\text{cm}^{-3}$ , and (f) Morrison 10  $\text{cm}^{-3}$  at ASCOS during 10 August – 3 September 2008.



# **GREATLY REDUCING** the Arctic Cloud Condensation Nuclei (CCN) in **PWRF LEADS** to accurate simulations of incident shortwave radiation at the surface

ASCOS has detailed aerosol observations



**Figure 13.** Scatter plots of simulated versus observed hourly incident shortwave radiation ( $\text{W m}^{-2}$ ) for (a) Control, (b) Snow Albedo, (c) Morrison 100  $\text{cm}^{-3}$ , (d) Morrison 50  $\text{cm}^{-3}$ , (e) Morrison 20  $\text{cm}^{-3}$ , and (f) Morrison 10  $\text{cm}^{-3}$  at ASCOS during 15-31 August 2008.



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